DigiChemTree enables programmable light-induced carbene generation for on demand chemical synthesis

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Supplementary Methods

S1. General

S1.1. Materials: Most of the reagents and chemicals are bought from Sigma-Aldrich and used as such without any further purification. Common organic chemicals and salts were purchased from AVRA chemicals, India. Water used for the experiments was deionized water (18.2 mS conductivity). All work-up and purification procedures were carried out with reagent-grade solvents in air. Analytical thin-layer chromatography (TLC) was performed using analytical chromatography silica gel 60 F254 precoated plates (0.25 mm). The developed chromatogram was analysed by UV lamp (254 nm). PTFE ($id = 500 \mu m$) tubing, T-junction, high-purity PFA tubing was purchased from Upchurch IDEX HEALTH &SCIENCE. The photo-batch reactor bought from Lelesil Mumbai India was slightly modified for the continuous flow reaction. Visible light (Blue, Red, Green LED) reactor was bought from the Smartchemsynth Machine Pvt. Ltd, Hyderabad.

S1.2. Analysis: High-resolution mass spectra (HRMS) were obtained from a JMS-T100TD instrument (DART) and Thermo Fisher Scientific Exactive (APCI). Nuclear magnetic resonance (NMR) spectra were recorded on a Bruker 600, 500, 400 or 300 MHz in CDCl₃ or DMSO- d_6 solvent. Chemical shifts for ${}^{1}H$ NMR are expressed in parts per million (ppm) relative to tetramethylsilane (δ 0.00 ppm). Chemical shifts for ¹³C NMR are expressed in ppm relative to CDCl₃ (δ 77.0 ppm). Data are reported as follows: chemical shift, multiplicity ($s =$ singlet, $d =$ doublet, $dd = doublet$ of doublets, $t = triplet$, $q = quartet$, $quin = quintet$, sext = sextet, m = multiplet), coupling constant (Hz). GC/MS analysis was conducted on a Shimadzu technology GCMS-QP2010 instrument equipped with a HP-5 column (30 m \times 0.25 mm, Hewlett-Packard) and inbuilt MS 5975C VL MSD system with triple axis detector.

S2. Automated system overview

S2.1. Automated system components

Table S1. Outlines the hardware components utilized in the automated platform, with color coding representing distinct modules (green: operation module, blue: reaction module, yellow: analysis module, purple: fraction sample collection).

S2.2. Automated system hardware module.

S2.2.1 Operational module

The HPLC pumps (figure S1a) and Harvard syringe pump (figure S1b) were directly interfaced to the main computer via an RS-232 interface or LAN. These pumps will help in introducing reactants and reagent solutions into the micro reactor with varied flow rate as the central computer's prescribed flow rate (fr). This control protocol also includes starting/stopping of the pump. The central computer and the HPLC pump communicated through serial communication using ASCII code to exchange information about flow rate, operational status, and duration. This facilitated the transmission of essential details from the main computer to the pumps, enabling them to commence their operations as required. The syringe pump (figure S1c) The parameters for the serial communication of the syringe pump with the computer are given as follows: Baud Rate ‐ 9600, Flow control – none. The basic control protocols include starting/stopping the pump and setting different parameters. Arduino (figure S1d) connected to syringe pump directly interfaced to the main computer via an RS-232 interface or LAN and helps in controlling flow rate. It has inbuilt proximity sensor and pulse will generate through Arduino program.

Figure S1. Picture of working syringe pump and HPLC pump (a) HPLC pump (Knauer) (b) syringe pump (Harvard) (c) Continuous syringe pump with Arduino (smartchemsynth) (d) Arduino.

S2.2.2 Reaction module

We employed a commercially accessible cylindrical blue LED (figure S2b) for the photochemical reaction, utilizing a programmable power supply manufacture by Owon (figure S2a) to regulate the lamp's power (measured in watts) by managing both current and voltage. The Blue LED produces light in the range of wavelength 450-495 nm and it can be operated up to 5 A current, and 14.5 v voltage corresponds to about 70 w wattage. Additionally, rotating fan was attached to the bottom of cylindrical blue LED light to maintain the room temperature throughout the reaction. The central computer and the power supply communicated through serial communication using ASCII code to exchange information about varied voltage, current and operational status.

Figure S2. Manual designed photo-flow reactor; (a) power supply (b-c) blue LED module with cooling fan (1-70W, 460 nm max); (d) 1mL PFA coiled reactor (1.2-meter length, $OD = 1.58$ mm and $id = 1.0$ mm).

Figure S3. 3D graph elucidating the correlation among voltage (V), current (Amp), and the emission of blue light (Wattage).

S2.2.3 Analysis module

In-line FTIR analysis

In-situ reaction analysis was accomplished by recording IR (functional group, shifting peak in product) spectra using a benchtop ReactIR 15 base unit with DS Micro Flow Cell (Mettler toledo). It works through sensing the amount of infrared radiation after passing through a sample, generating a 2D graph with absorption on the Y-axis and wavenumber on the X-axis, having optical range from 4000 to 650 cm⁻¹. The system collected spectra with 16 scans at resolution 4 cm^{-1} .

Figure S4. Actual photograph of ReactIR 15 flow cell setup.

Figure S5. Work flow of In-line FTIR measurement when running reaction optimization. **S2.2.4.** Collection module.

We employed a commercially accessible 3D printer as an automated collector. The Python program on the central system interfaced with the 3D printer and give commands to the stepper motors on the X, Y, and Z axis of the printer for movement. This information is transmitted via USB serial communication. PFA tubing (od $= 1/16$, id $= 1$ mm) is connected to the printer nozzle and move along x-axis, and a test tube stand is placed on the printing platform which move along Y-axis to collect the fraction of reaction mixture output (see figure S6). This configuration enables precise control of the 3D printer, facilitating tasks such as sample collection, reactor stabilization, and washing in diverse scenarios. With this 3D printer setup, we can collect maximum 22 fraction of out coming reaction mixture in one run of experiment.

Figure S6. (a) Original photograph of dismantle 3D printer; (b) assembled photograph of 3D printer as auto-fraction collector.

S2.3. Automated system software

Table S2. List of the software required for the automated system.

S2.4. Bayesian optimization

The machine learning algorithm utilized in this project is Bayesian Optimization (BO), implemented through the open-source package. Bayesian optimization in an algorithm which uses Baye's theorem to find the maximum of objective. It is a robust machine learning technique, especially suited for optimizing chemical reactions during the initial phases of process development its efficiency lies in the ability to navigate extensive reaction spaces effectively, forecasting optimal reaction conditions with high yields by assessing only a limited number of experiments. The selected initial points are the variable space (reaction conditions), the objectives to attain (e.g., maximize yield and/or conversion, minimize costs), the total number of experiments to perform, the information of communication port (e.g., pump $=$ COM 7, printer $=$ COM 9) and the overall experimental cost (indication how many cycles of experiment to be performed in each run). The initial points are chosen through Latin hypercube sampling for Euclidean and integral variables, while for discrete numeric values, selection is done uniformly at random. The variable space encompasses the range within which the objective is intended to be optimized. It accommodates both discrete and continuous variables. In Bayesian optimization incorporation of multiple variables of the same type (in a single line, as in String varA, varB, varC) is feasible, leaving the determination of the most effective among them to the model. Each time the BO calls the objective function, the platform is run, and the parameter settings are sent to the platform. The model then waits until the result is sent back before updating and deciding on the next experiment. **S2.4.1.** Step-by-step instructions for setting up the experiments and operating the automated system.

Step 1

Background collection: This marks the beginning of our new experiment. We'll start by selecting the wavenumber range and then proceed to click on "collect background." It's crucial to ensure that our solvent is running through the In-line IR. Upon clicking "collect background," a new dialogue box will appear, where we'll select 128 scans and proceed to collect the background.

Figure S7. Home page of the iC IR 7.0 containing step-by-step instructions on how to take solvent background before starting experiment.

Step 2

After background collection create new experiment by clicking on tab this dialogue box will appear.

Type your experiment name and select the folder to save your experiment at your desired location then select duration (1h-2day) and scan of sample interval (15sec) for one run.

Figure S8. User Settings page, where the name of the experiments, folder and the location they are saved to are defined.

Step 3

Upon creating the new experiment, you'll encounter this dialogue box. Firstly, (**a**) pin all the samples by clicking on "smart pin," followed by clicking on "pin 6 samples." Secondly, (**b**) export all the pinned spectra by clicking on "spectra" and then exporting all the files in CSV format only, which will be in an Excel file. Thirdly, (**c**) after clicking on "export," a new dialogue box will appear showing all the CSV files exported from the In-line IR. Create a text document in that folder and save it with a AB.py extension to save the Python code.

Figure S9. User Settings page, where in first step (a) pin all the sample, in second step (b) export spectrum file in CSV format and in third step (c) you can see all the spectrum file in excel format.

Step 4

Open spyder web app in central system where we will write our python code or open the previously saved python code. In this python code we have to define path in **mypath** and then we write the communication port for syringe pump, power supply and auto collector. Then we will give reaction condition variable such as flow rate (residence time), voltage, current and select no of cycles (1- 22) in one run.

Figure S10. Reaction parameter settings page, where you will define the file path and communication port with the instruments attached to central system.

voltage, current and communication port with the instruments attached to central system.

Figure S12. Example layout on excel file automatically generated from iC IR and bayesian optimizer.

S2.4.2. General Procedure for optimization with automated system.

List of starting material (2a-2g): Previously, reported protocol has been used to synthesized the diazo-compound.¹

Figure S13. Starting material diazo ester reported earlier**.**

Starting	Substrate	product	Probable	Reported
material			molecule	molecule
$R_2 - R_6 \frac{1}{11}$	ΟН		$1971 \times$	5675
0^{-R_1}	$R_7 - R_{11}$		$1159909 =$	
	(3) 1,159,909		2,286,180,639	
(2) 1971				
		(4)		
R_2-R_6	SΗ		1971×31582	2590
	$R_{12} - R_{16}$	R_{12} -R ₁₆	$= 62,248,122$	
	(5) 31,582			
(2) 1971		R_2-R_6 -		
		(6)		
R_2-R_6	NН	$\overline{\mathbf{O}}\cdot\mathbf{R}_1$ O ₅	1971×666981	2410
	$R_{17} - R_{21}$			
(2) 1971	(7) 666,981	R_2-R_6 $R_{17} - R_{21}$	1,314,619,551	
		(8)		
R_2-R_6 $+$		R_2-R_6	1971×64464	954
R_1			$= 127,058,544$	
	(9) 64,464			
(2) 1971		\mathbf{k}		
		(10)		
R_2-R_6			1971×46269	396
	R_{27} - R_{31}	R_2-R_6	$= 91,196,199$	
Ñ, (2) 1971	(11) 46,269	k_1		
		(12)		
R_2-R_6 .R ₁	R_{32} CN	R_{32}	$1971 \times$	385
	(13) 5,467,743		$5646743 =$	
N_{2} (2) 1971			11,129,730,45	
			3	
R_2-R_6 $+$		O.	1971×133666	113
		CO ₂ R ₃₃	$= 263,455,686$	
	R_{33}	$R_2-R_6\frac{H}{L}$		
(2) 1971	(15) 133666	(16)		
Total no of probable molecule = 1.5×10^{10}				
Total no of known molecule = 12523				

Table S3. Literature study of the probable molecules of product and their corresponding reported known molecule.

***** Data extracted from Reaxys on 07 march 2024

% known molecule = $\frac{12523}{15000000000}$ × 100

 $=$ ~ 0.00000083%

S3 Case study-1 carbene insertion (C-O bond formation) single objective multi-variant auto-optimization.

S3.1. Background collection

The collection of solvent background or an air background before automated experiment stand out as most important step in obtaining finest quality infrared data from a fully operational React IR 15. Each sample measurement will use the background to 'ratio out' all infrared absorbing materials in the optical path and the source solvent peaks. It will give infrared fingerprint end-result in form of absorbance versus wavenumber of only the reaction mixture components. For background collection set the scan to 128 scans at 4 cm^{-1} resolutions.

Sample preparation: We prepared 0.5 M stock solutions of compound **2a**, reagent **3a**, and product **4a** in ethyl acetate, with each solution loaded into separate syringes. Our analysis utilized an In-line FTIR system. The experimental procedure began by introducing ethyl acetate solvent using a syringe pump for 10 min, during which data was recorded. Subsequently, the stock solution of compound **2a** was introduced into the In-line FTIR for another 10 minutes. This process was repeated for the reaction product **4a** and reagent **3a**, each pumped for 10 minutes. After collecting all relevant data, we identified the signature peak present in the product. Using this peak as a reference, we employed a Bayesian optimizer to fine-tune and optimize the reaction conditions for improved results.

Figure S14. In-line IR background analysis of EtOAc, 0.5 M stock solution of **2a**, **3a**, and **4a** in EtOAc.

The distinctive keto peak associated with benzoic acid (**3a**) in the initial substrate undergoes a noticeable shift in the resulting product $(4a)$, aligning within the range of 1756 to 1775 cm⁻¹. This specific peak, falling within this range, is designated as the signature peak for our analysis. During the optimization of the reaction through Bayesian methods, this signature peak serves as a pivotal reference point. We utilize it to calculate the area under the curve in the In-line FT-IR spectra, providing a quantitative measure of the area in the forthcoming reaction mixture.

Micro reactor system: As shown in Figure. S2d, we had utilized pump to deliver the solution at varied flow rates. Stock solution starting material and reagent were introduced through a Tmixer with the same flow rate to maintain a stoichiometric ratio. Subsequently, they passed through a PFA tubing (od $1/16$, id 1mm, $l = 1.3$ m, vol = 1 mL) for the carbene insertion reaction. The cylindrical reactor was enveloped by cylindrical blue light LED for irradiation. To enhance light absorption, the entire reactor was covered with aluminum foil.

S3.2. General procedure for the auto-optimized synthesis of compound 3a.

In our approach we are employing a python-coded based Bayesian optimization strategy for further refinement. Initial steps involved the preparation of stock solutions for compound **2a** (0.1 M in EtOAc) and reagent **3a** (0.2 M in EtOAc), each filled into separate syringes and connected to a syringe pump. The solutions were then directed through a PFA tubular reactor (inner diameter $= 1$ mm, length $= 1.3$ m, volume $= 1$ mL) surrounded by a cylindrical-shaped blue LED light source. Once the solution setup was complete, input ranges for variable flow rates, voltages, and current were specified in the Python code designed for the reaction. The Bayesian optimizer systematically explored these varying reaction conditions, aiming to achieve maximum yield. The optimization process involved running 50-60 experiments in a 24 h time fame, and the results were tabulated in the optimization table (Table S4).

S3.2.1. Python code for optimizing condition of carbene insertion reaction (C-O bond formation).

```
\Box ab1.py
    1 from os import listdir
    2 from os.path import isfile, join
   3 import serial
   5 import numpy as np
   6 import pandas as pd
   7 import time
   8 from scipy.integrate import trapz
   10 #step1: be sure to the address of the files that the ftir data is exported is matching to line 11 (mypath)
   11 mypath = "C:\\Users\\Admin\\Desktop\\ruchi\\Exp 2023-09-22 14-27"
   12 onlyfiles = [f for f in listdir(mypath) if isfile(join(mypath, f))]
   1314
   15 #step2: make sure that pump and the potentiostat is correctly addressed in the Line 16 and 17
   16 pump 1 = serial.Serial("COM4",9600) #Harvard Pump
   17 port = serial.Serial("\overline{COM1}", 115200)
   18 printer = serial.Serial("COM10", 115200, timeout=1)
   1920
   21
   22 #step 3: grab the Lines from 22 to 90 and presss f9
   23 def area under(data, start, end):
   x = np-flip(data.iloc[start:end, 0].to_number())25
        y = np簡(data.iloc[start:end,1].to numpy())
   26
        area = trapz(y,x)
   27
        return np.abs(area)
   28
   29 def file namer(num):
         str1 = str(num)30
   31length = int(len((str1)))\text{empty} = \text{''}3233
         for i in range(5-length):
   34empty = empty + '0'35
   36
         return empt+str1
   3738
   39 def ftir_extract(filename,init,end):
   40
   41
         filename = filename
   42
   43
         temp_df = pd.read_csv(filename)
   44# nump_df = temp_df.to_numpy()
   45
         area = area under(temp df, init, end)
         # max\_peak = np.max(nump_df[90:120,1])46
   47
         print(area)
```

```
48
49
      return area
50
51
52 def function(flowrate 1,v,i):
53
54
       #set the pumps with the flowrate as the desired flowrate for the function
55
56
      fr 1 = flowrate 1 #ml/min
57
      pump_1.write(('irate '+str(fr_1)+' ml/min\r\n').encode())
58
59
      time.sleep(0.1)60
61
      #set the com port for potentiostat and set the voltage and current
62
      vol = vcurr = i63
64
      port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                       #to change the voltge we need to use "VOLT 1" command
                                                       #to change the current we need to use "CURR 1" command
65
      port.write(('CURR '+str(curr)+'\r\n').encode())
66
67
68
      #pumps run
69
      pump_1.write((b'irun\r\n'))
70
      time.sleep(0.1)71
      time.sleep(3636)
72
73 def function2(flowrate 1,v,i):
74
      time.sleep(180)
75
76
      files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
77
78
      val = 079
80
      #change wavelengths as per product here.
81
      f row=21 #first row of range for wavelength as per IR CSV
      1 row=28 #Last row of range for wavelength as per IR CSV
82
83
84
      val += ftir_extract(files[-1],f_row,l_row)
85
      val+=ftir_extract(files[-2],f_row,l_row)
86
      val+=ftir_extract(files[-3],f_row,l_row)
87
88
      avg_val = val/389
90
      return avg_val
91
92
93 #step 4:grab the line 93 and f9
94 from skopt.optimizer import Optimizer
```

```
- 95
96
97 #step5:in line 96 we have to define the range that (flowrate,voltage,current) (from,to) and after (anytime) appllying changes you need to grab the line 96 and f9
98 #flowrates are in ml/min, voltage in V, Current in Ampere
99 bounds = [(0.05, 0.125), (10, 14.5), (4.9, 5.0)]100
101
102 #step 6: grab the line 100 and f9
103 opter =Optimizer(bounds,base_estimator='gp',n_initial_points=3,acq_func="EI",random_state=np.random.randint(3326))
104
105
106 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated
107 number of cycles = 22
108 results = []
109 flowrates 1 = []110 \text{ vs } = [1]111 currents = []
112
113 product wavelength=True #set to true if product wavelengths being monitored
114
115 if product_wavelength == True:
116
      val=1117 else:
118
       val=-1119
120
121 # Step 8: Test Tubes on Printer
122 USE PRINTER = True
123 REST HEIGHT = 200
124 X HOME = -5
125 Y HOME = 20
126 Z HOME = 175
127 DEFAULT PUMP TIME="1"
128 # Distance between test tubes
129 X SPACING=20
130 Y SPACING=20
131 # Number of test tubes
132 X ROWS = 11
133 Y COLUMNS = 4134
135 def send_cmd(cmd):
136
      print(cmd)
137
       printer.write(f"{cmd}\n".encode("ASCII"))
138
139 def move(x=None, y=None, z=None):
```

```
140
       s = "G0"141
       if x is not None:
142
            s += f''X{x}''143
       if y is not None:
144
            s \leftarrow f''Y\{y\}''145
       if z is not None:
146
            s \leftarrow f''Z{z}''147
148
        s+= "F5000"
149
       send_cmd(s)
150
151 def printer_positions():
152
       for j in range(Y_COLUMNS):
153
            for i in range(X ROWS):
154
                if j\%2 == 1:
155
                    yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
156
                else:157
                    yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
158
159 # Run this.
160 tube location = list(printer positions())
161
162
163 for i in range(number_of_cycles):
164
        move(*tube_location[2*i])
165
        asked = opter ask()166
        function(asked[0],asked[1],asked[2])
167
        move(*tube_location[2*i+1])
168
        \text{told} = function2(asked[0], asked[1], asked[2])
169
170
        print(f"area under the curve in the round \{i: .2f\} = \{told: .2f\}')
171
        opter.tell(asked,-told*val)
172
        results.append(told)
173
        flowrates_1.append(asked[0])
174
        vs.append(asked[1])
175
        currents.append(asked[2])
176
177
        dict1 = \{ "flower1" : flowrates_1", "voltages":vs, "currents":currents", "area-results":results" \}178
        df2 = pd.DataFrame179
        df2.to_csv("output round "+str(i)+".csv")
180
181
182
183 pump 1.write(b'stop\r\n')
184
185
186
```


Table S4. Auto-optimization table of carbene insertion reaction into O-H bonds of carboxylic acid.

Reaction condition: compound **2a** (0.1 M in EtOAc); reagent **3a** (0.2 M in EtOAc); 1 mL reactor volume.

Graph: We have plotted 3D graph of optimization table S4, we have taken flow rate on X-axis, blue light intensity (watt) on Y-axis and product yield on Z axis.

Figure S15. AI based system to auto-optimize and navigate this complexity and identify the optimal conditions for the photo activated C-O bond formation reaction. Compound **2a** (0.1 M in EtOAc); reagent **3a** (0.2 M in EtOAc); 1 mL reactor volume.

Figure S16. 2D graph between no of experiments performed versus yield (%) for the AI based autooptimization of photo activated O-H reaction. Compound **2a** (0.1 M in EtOAc); reagent **3a** (0.2 M in EtOAc); 1 mL reactor volume.

Figure S17. AI based system navigated multi-numerical variable complexity and identify the optimal conditions for the photo activated O-H reaction. Compound **2a** (0.1 M in EtOAc); reagent **3a** (0.2 M in EtOAc); 1 mL reactor volume.

S3.3. Procedure for the synthesis, of compound 4a for longer time.

Figure S18. Schematic presentation of continuous flow for the synthesis, of compound **4a.** To prepare the stock solution of compound **2a** (2.20 g, 0.01 mol) was dissolved in ethyl acetate (100 mL) charged in one syringe, another syringe charged with the reagent **3a** (2.56 g, 0.02 mol) dissolved in ethyl acetate (100 mL). These two syringes connected via pump and out-put is further connected with the T_1 -mixer. Both syringes were running with the 50 μ L/min. flow rate each to maintain the stoichiometry and then passed through PFA tubular reactor ($id = 1000$ μ m, $l = 1.3$ m, vol. = 1 mL) under blue light (70 W) exposure. The room temperature of the reactor was controlled by fan attached to the bottom of the photochemical reactor. The out-put of the tubular reactor was connected with spring based back pressure regulator $(\sim 3 \text{ bar})$ to maintain the evaporation. Then out coming first one hour of the product mixture **4a** was discarded and next 5 h of the product mixture [30 mL; **2a** (0.32 g)] was collected in HPLC bottle. The EtOAc reaction mixture washed it with 10% aq. NaOH and separated through the separating funnel. The organic EtOAc phase was concentrated under reduced pressure to give the product **4a** (0.45 g in 5 h, 99.88%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 8.12

– 8.10 (m, 2H), 7.60 – 7.51 (m, 3H), 7.47 – 7.38 (m, 4H), 6.15 (s, 1H), 3.74 (s, 3H). **¹³C NMR (126 MHz, CDCl3)** δ 168.97, 165.71, 135.36, 133.65, 132.55, 129.99, 129.14, 129.03, 128.55, 74.14, 52.82. **IR (max):** 3023.51, 1754.46, 1724.80, 1255.08, 815.32 cm-1 . **HRMS (ESI):** *m/z* calcd for C16H14ClO4 [M+H]⁺305.7335, found 305.7332.

Space time yield in previous reported batch process²

Productivity $= 33$ mg in 12 h

Productivity (per h):
$$
=
$$
 $\frac{0.033}{12} = 0.00275$ g/h

Space time yield ∶= productivity volume of reactor = 0.0028 4 $= 0.0007$ g $mL^{-1}h^{-1}$

Table S5: Comparative table for the carbene insertion into O-H bonds of carboxylic acid.

S3.5. General procedure for scope of substrate for carbene insertion into the O-H bonds of carboxylic acid for synthesis of compound **4b**−**4p.**

Figure S19. Scope of substrate for the photo activated O-H reaction. Compound **2** (0.1 M in EtOAc); reagent **3** (0.2 M in EtOAc); 1 mL reactor volume.

Example 2. 1-(4-chlorophenyl)-2-methoxy-2-oxoethyl 2,4,5-trifluorobenzoate **(4b):**

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3b** (2,4,5 trifluorobenzoic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.5 (10% ethylacetate/hexane); to give compound **4b** (0.48 g in 5 h, 90%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.90 – 7.83 (m, 1H), 7.51 – 7.49 (m, 2H), 7.42 – 7.39 (m, 2H), 7.07 – 7.01 (m, 1H), 6.13 (s, 1H), 3.76 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 168.57, 161.79, 159.44, 157.34, 154.87, 152.81, 147.69, 145.64, 135.69, 131.89, 129.31, 129.04, 120.50, 120.33, 107.62, 107.46, 107.40, 107.23, 74.78, 53.10. **¹⁹F NMR (376 MHz, CDCl3)** δ -107.92, -107.95, -107.96, -107.99, -123.52, -123.55, -123.59, -123.61, -140.79, -140.85, -140.90.**IR (max):** 3021.92, 2925.33, 1746.25, 1623.42, 1518.64, 1216.49, 824.87 cm-1 . **HRMS (ESI):** *m/z* calcd for **C16H11ClF3O4** [M+H]⁺359.0292, found 359.0298.

Example 3. 1-(4-chlorophenyl)-2-methoxy-2-oxoethyl benzo[d][1,3]dioxole-5-carboxylate **(4c):**

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3c**
(benzo[*d*][1,3]dioxole-5-carboxylic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (10% ethylacetate/hexane); to give compound **4c** (0.45 g in 5 h, 86%) as a colorless oil **¹H NMR (400 MHz, CDCl3)** δ 7.74 – 7.72 (m, 1H), 7.52 – 7.49 (m, 3H), 7.41 – 7.39 (m, 2H), 6.85 (d, *J* = 8.2 Hz, 1H), 6.10 (s, 1H), 6.05 (s, 2H), 3.75 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 169.13, 165.13, 152.34, 147.95, 135.44, 132.66, 131.09, 129.21, 129.08, 126.16, 123.01, 109.85, 108.24, 102.06, 74.15, 52.90. **IR (max):** 2955.71, 2920.24, 1754.04, 1718.03, 1256.96, 1036.39, 831.60 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H14ClO6** [M+H]⁺349.0473, found 349.0475.

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3d** (4 isobutylbenzoic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.4 (10% ethylacetate/hexane); to give compound **4d** (0.46 g in 5 h, 86%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 8.04 – 8.01 (m, 2H), 7.53 – 7.51 (m, 2H), 7.39 – 7.37 (m, 2H), 7.22 (d, *J* = 8.3 Hz, 2H), 6.14 (s, 1H), 3.73 (s, 3H), 2.52 (d, *J* = 7.2 Hz, 2H), 1.91 – 1.83 (m, 1H), 0.89 (d, *J* = 6.6 Hz, 6H). **¹³C NMR (101 MHz, CDCl3)** δ 169.02, 165.73, 148.11, 135.25, 132.68, 129.90, 129.27, 129.07, 129.00, 126.57, 73.97, 52.71, 45.42, 30.12, 22.29. **IR (max):** 3022.14, 2960.22, 1753.90, 1721.69, 1492.80, 1215.16, 1016.94 cm-1 . **HRMS (ESI):** *m/z* calcd for **C20H22ClO4** [M+H]⁺361.1201, found 361.1209.

Example 5. 1-(4-chlorophenyl)-2-methoxy-2-oxoethyl 4-phenoxybenzoate (4e):

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3e** (4 phenoxybenzoic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.6 (10% ethylacetate/hexane); to give compound **4e** (0.49 g in 5 h, 83%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 8.11 – 8.08 (m, 2H), 7.54 – 7.52 (m, 2H), 7.42 – 7.38 (m, 4H), 7.22 – 7.18 (m, 1H), 7.09 – 7.00 (m, 4H), 6.15 (s, 1H), 3.76 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 169.06, 165.19, 162.51, 155.48, 135.36, 132.65, 132.22, 130.13, 129.15, 129.03, 124.72, 123.25, 120.23, 117.40, 74.05, 52.83. **IR (max):** 3022.03, 1754, 1720.35, 1491.57, 1215.73, 865.28 cm-1 . **HRMS (ESI):** *m/z* calcd for **C22H18ClO5** [M+H]⁺397.0837, found 397.0847.

Example 6. 1-(4-chlorophenyl)-2-methoxy-2-oxoethyl benzofuran-2-carboxylate (4f):

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3f** (benzofuran-2-carboxylic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (10% ethylacetate/hexane); to give compound **4f** (0.45 g in 5 h, 87%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.67 –

7.65 (m, 2H), 7.57 – 7.51 (m, 3H), 7.45 – 7.37 (m, 3H), 7.30 – 7.25 (m, 1H), 6.19 (s, 1H), 3.75 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 168.53, 158.52, 156.04, 144.36, 135.54, 132.01, 129.17, 129.11, 128.12, 126.81, 123.99, 123.02, 115.41, 74.21, 52.94. **IR (max):** 2956.04, 2854.56, 1730.43, 1566.86, 1172.31, 888.28 cm-1 . **HRMS (ESI):** *m/z* calcd for **C18H14ClO⁵** [M+H]⁺ 345.0524, found 345.0531.

Example 7. Methyl 2-(4-chlorophenyl)-2-(2-(2,4,5-trifluorophenyl)acetoxy)acetate (4g):

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3g** (2-(2,4,5 trifluorophenyl)acetic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.4$ (10% ethylacetate/hexane); to give compound **4g** (0.48 g in 5 h, 87%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.39 – 7.34 (m, 4H), 7.22 – 7.15 (m, 1H), 6.97 – 6.90 (m, 1H), 5.94 (s, 1H), 3.77 (d, *J* = 3.8 Hz, 2H), 3.71 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 169.27, 168.63, 157.40, 157.32, 154.95, 154.88, 150.95, 150.82, 150.69, 148.46, 148.32, 148.20, 148.00, 147.87, 145.60, 145.57, 145.47, 145.44, 135.54, 131.94, 129.17, 128.99, 119.33, 119.28, 119.13, 119.09, 117.10, 117.05, 117.00, 116.92, 116.87, 116.82, 105.83, 105.62, 105.55, 105.34, 74.36, 52.89, 33.32. **¹⁹F NMR (471 MHz, CDCl3)** δ -118.27, -118.30, -134.23, -134.27, -142.50, -142.54, -142.57. **IR (max):** 3024.90, 2958.73, 1749.06, 1633.89, 1215.42, 979.95, 850.85. **HRMS (ESI):** *m/z* calcd for **C17H13ClF3O⁴** [M+H]⁺373.0449, found 373.0456.

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3h** (2-(4 isobutylphenyl)acetic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.4$ (10% ethylacetate/hexane); to give compound **4h** (0.49 g in 5 h, 88%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.37 – 7.32 (m, 4H), 7.20 (d, *J* = 8.1 Hz, 2H), 7.10 (d, *J* = 8.1 Hz, 2H), 5.91 (s, 1H), 3.74 (d, *J* = 3.8 Hz, 2H), 3.69 (s, 3H), 2.45 (d, *J* = 7.2 Hz, 2H), 1.89 – 1.79 (m, 1H), 0.89 (d, *J* = 6.6 Hz, 6H). **¹³C NMR (101 MHz, CDCl3)** δ 171.00, 168.85, 140.75, 135.27, 132.28, 130.43, 73.92, 52.76, 45.09, 40.47, 30.23, 22.39. **IR (max):** 3020.64, 2957.88, 1748.49, 1492.75, 1215.51, 1016.03 cm-1 . **HRMS (ESI):** *m/z* calcd for **C21H24ClO4** [M+H]⁺375.8685, found 375.8690.

Example 9. 1-(4-chlorophenyl)-2-methoxy-2-oxoethyl 2-(4-isobutylphenyl)propanoate (4i):

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3i** (2-(4 isobutylphenyl)propanoic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (10% ethylacetate/hexane); to give compound **4i** (0.49 g in 5 h, 85%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.31 (d, *J* = 1.5 Hz, 2H), 7.27 – 7.19 (m, 4H), 7.13 – 7.06 (m, 2H), 5.89 (d, *J* = 3.3 Hz, 1H), 3.90 – 3.83 (m, 1H), 3.65 (d, *J* = 31.5 Hz, 3H), 2.44 (dd, *J* = 10.1, 7.2 Hz, 2H), 1.89 – 1.79 (m, 1H), 1.56 (dd, *J* = 7.2, 2.0 Hz, 3H), 0.89 (t, *J* = 6.8 Hz, 6H). **¹³C NMR (101 MHz, CDCl3)** δ 173.89, 173.82, 168.94, 168.74, 140.78, 140.71, 137.02, 136.92, 135.18, 135.08, 132.44, 132.39, 129.40, 129.33, 128.98, 128.91, 128.82, 128.71, 127.46, 127.37, 73.90, 73.71, 52.72, 52.59, 45.10, 45.06, 44.96, 44.82, 30.24, 22.41, 18.49, 18.35. **IR (max):** 3020.99, 2956.85, 2872.11, 1744.81, 1599.53, 1215.33, 1016.16 cm-1 . **HRMS (ESI):** *m/z* calcd for **C22H26ClO⁴** [M+H]⁺ 389.1514, found 389.1520.

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3j** (2-([1,1' biphenyl]-4-yl)acetic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (10% ethylacetate/hexane); to give compound **4j** (0.52 g in 5 h, 87%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.58 – 7.55 (m, 4H), 7.45 – 7.32 (m, 9H), 5.94 (s, 1H), 3.87 – 3.77 (m, 2H), 3.70 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 170.82, 168.84, 140.74, 140.29, 135.36, 132.22, 132.18, 129.83, 129.07, 128.94, 128.81, 127.38, 127.09, 74.04, 52.80, 40.45. **IR(max):** 3024.43, 1744.86, 1489.15, 1215.88, 1013.88 cm-1 . **HRMS (ESI):** *m/z* calcd for **C23H20ClO⁴** [M+H]⁺395.1045, found 395.1055.

Example 11. Methyl 2-(2-(9H-fluoren-9-yl)acetoxy)-2-(4-chlorophenyl)acetate (4k):

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3k** (2-(9*H*fluoren-9-yl)acetic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.45$ (10% ethylacetate/hexane); to give compound **4k** (0.55 g in 5 h, 91%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.71 (d, *J* = 7.5 Hz, 2H), 7.50 (dd, *J* = 10.7, 7.6 Hz, 2H), 7.43 – 7.29 (m, 8H), 6.04 (s, 1H), 4.49 (t, *J* = 6.9 Hz, 1H), 3.78 (s, 3H), 3.01 (dd, *J* = 16.5, 6.8 Hz, 1H), 2.90 (dd, *J* = 16.5, 7.1 Hz, 1H). **¹³C NMR (101 MHz, CDCl3)** δ 171.66, 168.85, 145.93, 140.86, 140.81, 135.32, 132.15, 129.05, 129.01, 127.59, 127.30, 127.25, 124.46, 120.00, 74.07, 52.83, 43.37, 38.15. **IR (max):** 3019.04, 2922.32, 1741.47, 1489.45, 1216.03, 1144.72 cm-1 . **HRMS (ESI):** *m/z* calcd for **C24H20ClO⁴** [M+H]⁺407.1045, found 407.1053.

Example 12. 1-(4-Chlorophenyl)-2-methoxy-2-oxoethyl (2S)-2-methoxy-2-phenylacetate (4l):

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3l** ((R)-3-

methoxy-3-phenylpropanoic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $\mathbf{R}f = 0.6$ (10% ethylacetate/hexane); to give compound **4l** (0.44 g in 5 h, 82%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.50 – 7.48 (m, 2H), 7.41 – 7.33 (m, 7H), 5.93 (s, 1H), 4.90 (s, 1H), 3.59 (s, 3H), 3.49 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 170.10, 168.34, 135.70, 135.47, 132.02, 129.14, 129.00, 128.96, 128.69, 127.46, 82.49, 74.15, 57.71, 52.76. **IR (max):** 2929.68, 1750.89, 1598.38, 1217.54, 1164.43, 1016.87, 828.38 cm-1 . **HRMS (ESI):** *m/z* calcd for **C22H18ClO5** [M+H]⁺363.0994, found 363.0999.

Example 13. 1-(4-chlorophenyl)-2-methoxy-2-oxoethyl 5-methylisoxazole-3-carboxylate (4m):

The title compound was synthesised following the general procedure described in section 3.3, and involve corresponding reactant exchange with compound **2a** and compound **3m** (5 methylisoxazole-3-carboxylic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.6 (10% ethylacetate/hexane); to give compound **4m** (0.38 g in 5 h, 82%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.87 – 7.83 (m, 2H), 7.77 – 7.68 (m, 2H), 6.83 (d, *J* = 0.8 Hz, 1H), 6.50 (s, 1H), 4.12 (s, 3H), 2.86 (d, *J* = 0.7 Hz, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 171.80, 168.21, 159.34, 155.55, 135.69, 131.62, 129.25, 129.15, 128.83, 128.04, 111.21, 102.55, 74.70, 72.26, 53.07, 12.40. **IR (max):** 3021.10, 2957.90, 1746.23, 1598.19, 1207.20, 1006.59, 808.66 cm-1 . **HRMS (ESI):** *m/z* calcd for C₁₄H₁₃ClNO₅ [M+H]⁺ 310.0477, found 310.0478.

Example 14. 1-(4-chlorophenyl)-2-methoxy-2-oxoethyl 5-acetylthiophene-2-carboxylate (4n):

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3n** (5 acetylthiophene-2-carboxylic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.6$ (10% ethylacetate/hexane); to give compound **4n** (0.47 g in 5 h, 90%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.84 (d, *J* $= 4.0$ Hz, 1H), 7.64 (d, $J = 4.0$ Hz, 1H), 7.49 – 7.46 (m, 2H), 7.40 – 7.37 (m, 2H), 6.09 (s, 1H), 3.74 (s, 3H), 2.58 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 190.79, 168.43, 160.69, 149.64, 138.16, 135.61, 134.49, 131.85, 131.76, 129.22, 128.99, 74.54, 53.00, 27.07. **IR (max):** 3021.89, 1724.77, 1673.48, 1524.47, 1214.90, 1017.28 cm-1 . **HRMS (ESI)**: *m/z* calcd for C16H14ClO5S [M+H]+ 353.0245, found 353.0250.

Example 15. 1-(4-chlorophenyl)-2-methoxy-2-oxoethyl 5-chlorothiophene-2-carboxylate (**4o**)**:**

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3o** (5 chlorothiophene-2-carboxylic acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.5 (10% ethylacetate/hexane); to give compound **4o** (0.47 g in 5 h, 91%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.68 (d, *J*

 $= 4.1$ Hz, 1H), $7.48 - 7.46$ (m, 2H), $7.40 - 7.37$ (m, 2H), 6.95 (d, $J = 5.0$ Hz, 1H), 6.08 (s, 1H), 3.74 (s, 3H). **¹³C NMR (126 MHz, CDCl3)** δ 168.53, 160.11, 138.53, 135.47, 134.15, 132.03, 130.39, 129.13, 128.95, 127.54, 74.20, 52.87. **IR (max):** 3022.57, 1755.23, 1717.81, 1422.40, 1215.11, 1089.70 cm-1 . **HRMS (ESI):** *m/z* calcd for **C14H11Cl2O4S** [M+H]⁺344.9750, found 344.9756.

Example 16. 1-(4-chlorophenyl)-2-methoxy-2-oxoethyl (1s,3s)-adamantane-1-carboxylate **(4p):**

The title compound was synthesised following the general procedure described in section **3.3**, and involve corresponding reactant exchange with compound **2a** and compound **3p** (admantyl acid). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (10% ethylacetate/hexane); to give compound $4p$ (0.48 g in 5 h, 88%) as viscous oil. **¹H NMR (400 MHz, CDCl3)** δ 7.42 – 7.40 (m, 2H), 7.35 – 7.32 (m, 2H), 5.88 (s, 1H), 3.68 (s, 3H), 2.02 (s, 3H), 1.97 (s, 6H), 1.71 (s, 6H). **¹³C NMR (101 MHz, CDCl3)** δ 176.70, 169.12, 135.10, 132.72, 129.00, 128.80, 73.24, 52.65, 40.75, 38.69, 36.46, 27.90. **IR (max):** 2907.80, 2853.75, 1754.93, 1730.89, 1215.77, 1072.97 cm-1 . **HRMS (ESI):** *m/z* calcd for **C20H24ClO4** [M+H]⁺363.1358, found 363.1364.

S4. Case study-2: Carbene insertion (C-S bond formation) single objective multi-variant autooptimization.

S4.1 Background collection

Sample Preparation: We prepared 0.5 M stock solutions of compound **2a**, reagent **5a**, and product **6a** in ethyl acetate, each loaded into separate syringes. For our analysis, we utilized an In-line FTIR system. The experimental protocol commenced with the initial introduction of ethyl acetate solvent for 10 minutes using a syringe pump, during which data was recorded. Subsequently, the stock solution of compound **2a** was introduced into the In-line FTIR for another 10 minutes. This procedure was repeated for the reaction product **6a** and reagent **5a**, with each pumped for 10 minutes. After collecting all relevant data, we identified the signature peak present in the product. Using this peak as a reference, we employed a Bayesian optimizer to fine-tune and optimize the reaction conditions for enhanced outcomes.

Figure S20. In-line IR background analysis of EtOAc, 0.5 M stock solution of **2a**, **5a**, and **6a** in EtOAc.

The distinctive shifting peak associated with product (**6a**) aligning within the range of 2070 to 2085 cm⁻¹ was observed. This specific peak, falling within this range, is designated as the signature peak for our analysis. During the optimization of the reaction through Bayesian methods, this signature peak serves as a pivotal reference point. We utilize it to calculate the area under the curve in the In-line FT-IR spectra, providing a quantitative measure of the area in the forthcoming reaction mixture.

S4.2. General procedure for the auto-optimized synthesis of compound 6a.

In our approach we are employing a Python-coded based Bayesian optimization strategy for further refinement. Initial steps involved the preparation of stock solutions for compound **2a** (0.1 M in EtOAc) and reagent **5a** (0.2 M in EtOAc), each filled into separate syringes and connected to a syringe pump. The solutions were then directed through a PFA tubular reactor (inner diameter $= 1$ mm, length $= 1.3$ m, volume $= 1$ mL) surrounded by a cylindrical-shaped blue LED light source. Once the solution setup was complete, input ranges for variable flow rates, voltages, and current were specified in the Python code designed for the reaction. The Bayesian optimizer systematically explored these varying reaction conditions, aiming to achieve maximum yield. The optimization process involved running 70-80 experiments and the results were tabulated in the optimization table (Table S6).

S4.2.1. Python code for optimizing condition of carbene insertion reaction (C-S bond formation).

```
口 ab2.py 因
    1 from os import listdir
    2 from os.path import isfile, join
    3 import serial
    5 import numpy as np
    6 import pandas as pd
    7 import time
    8 from scipy.integrate import trapz
   10 #step1: be sure to the address of the files that the ftir data is exported is matching to line 11 (mypath)
   11 mypath = "C:\\Users\\Admin\\Desktop\\ruchi\\Exp 2023-10-09 10-24"
   12 onlyfiles = [f for f in listdir(mypath) if isfile(join(mypath, f))]
   131415 #step2: make sure that pump and the potentiostat is correctly addressed in the Line 16 and 17
   16 pump 1 = serial.Serial("COM4",9600) #Harvard Pump
   17 port = serial.Serial("COM1",115200)
   18 printer = serial.Serial("COM11", 115200, timeout=1)
  19
   20
  21
   22 #step 3: grab the lines from 22 to 90 and presss f9
   23 def area under(data, start, end):
   24 \times = np-flip(data.iloc[start:end, 0].to_number())25
        y = np.flip(data.iloc[start:end,1].to_numpy())
   26
         area = trapz(y,x)27
         return np.abs(area)
   28
   29 def file namer(num):
   30
         str1 = str(num)31length = int(len((str1)))empty = "32
         for i in range(5-length):
   33
             empty = empty + '0'34
   35
   36
         return empt+str1
   37
   38
   39 def ftir_extract(filename,init,end):
   40
  41
         filename = filename
   42
   43
         temp_df = pd.read_csv(filename)
   44
         # nump_df = temp_df.to_nump(y))area = area_under(temp_df, init, end)
   45
         # max\_peak = np.max(nump_d[f[90:120,1])46
   47
         print(area)
```

```
48
49
      return area
50
51
52 def function(flowrate_1,v,i):
53
54
       #set the pumps with the flowrate as the desired flowrate for the function
55
56
      fr 1 = flowrate 1 #ml/min
57
      pump_1.write(('irate '+str(fr_1)+' ml/min\r\n').encode())
58
59
      time.sleep(0.1)60
61
      #set the com port for potentiostat and set the voltage and current
62
      vol = v63
      curr = i64
      port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                         #to change the voltge we need to use "VOLT 1" command
65
      port.write(('CURR '+str(curr)+'\r\n), encode())#to change the current we need to use "CURR 1" command
66
67
68
      #pumps run
69
      pump_1.write((b'irun\n\n\rightharpoonup n'))70
      time.sleep(0.1)71time.sleep(2400)
7273 def function2(flowrate_1,v,i):
74
      time.sleep(180)
75
76
      files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
77
78
      val = 079
80
      #change wavelengths as per product here.
81
      f row=17 #first row of range for wavelength as per IR CSV
82
      1 row=23 #Last row of range for wavelength as per IR CSV
83
84
      val += ftir extract(files[-1],f row,l row)
85
      val+=ftir extract(files[-2],f row,l row)
86
      val+=ftir extract(files[-3],f row,l row)
87
88
      avg val = val/389
90
      return avg_val
91
92
93 #step 4:grab the Line 93 and f9
94 from skopt.optimizer import Optimizer
```

```
95
 96
 97 #step5:in line 96 we have to define the range that (flowrate, voltage, current) (from, to) and after (anytime) appllying changes you need to grab the line 96 and f9
 98 #flowrates are in ml/min, voltage in V, Current in Ampere
 99 bounds = [(0.05, 0.2), (10, 14.5), (4.9, 5.0)]100
101
102#step 6: grab the line 100 and f9
103 opter =Optimizer(bounds,base estimator='gp',n initial points=3,acq func="EI",random state=np.random.randint(3326))
104
105
106 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated
107 number of cycles = 22
108 results = []
109 flowrates 1 = []110 \text{ vs } = []111 currents = []
112
113 product wavelength=True #set to true if product wavelengths being monitored
114
115 if product_wavelength == True:
116 val=1117 else:
118
       val=-1119
120
121 # Step 8: Test Tubes on Printer
122 USE_PRINTER = True
123 REST HEIGHT = 200
124 X HOME = -5125 \text{ Y} HOME = 20
126 Z HOME = 175
127 DEFAULT_PUMP_TIME="1"
128 # Distance between test tubes
129 X SPACING=20
130 Y SPACING=20
131 \# Number of test tubes
132 X ROWS = 11
133 Y_COLUMNS = 4
134
135 def send_cmd(cmd):
136
       print(cmd)
137
       printer.write(f"{cmd}\n".encode("ASCII"))
138
139 def move(x=None, y=None, z=None):
```

```
140
       s = "60"141
        if x is not None:
           s \leftarrow f''X\{x\}''142
143
        if y is not None:
144
           s = f''Y(y)''145
        if z is not None:
146
           s \leftarrow f''Z{z}''147
148
        s+= "F5000"
149
        send_cmd(s)
150
151 def printer_positions():
152
        for j in range(Y COLUMNS):
153
            for i in range(X_ROWS):
154
                if jX2=-1:
155
                   yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
156
                else:
157
                   yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
158
159 # Run this.
160 tube_location = list(printer_positions())
161
162
163 for i in range(number of cycles):
       move(*tube location[2*i])
164
        asked = opter ask()165
166
        function(asked[0],asked[1],asked[2])
167
        move(*tube location[2*i+1])168
        told = function2(asked[0], asked[1], asked[2])
169
170
        print(f"area under the curve in the round \{i: .2f\} = \{told: .2f\}')
171
        opter.tell(asked,-told*val)
172
        results.append(told)
173
        flowrates_1.append(asked[0])
174
        vs.append(asked[1])
175
       currents.append(asked[2])
176
177
        dict1 = {"flowrate_1":flowrates_1,"voltages":vs, "currents":currents,"area-results":results}
178
        df2 = pd.DataFrame(dict1)179
        df2.to_csv("output round "+str(i)+".csv")
180
181
182
183 pump_1.write(b'stop\r\n')
184
185
186
```


Table S6. Auto-optimization table of carbene insertion reaction into S-H bonds of thiophenol.

Reaction condition: compound **2a** (0.1 M in EtOAc); reagent **5a** (0.2 M in EtOAc); 1 mL reactor volume.

Graph: We have plotted 3D graph of optimization table S6, we have taken flow rate on Xaxis, blue light intensity (watt) on Y-axis and product yield on Z axis.

Figure S21. AI based system to auto-optimize and navigate this complexity and identify the optimal conditions for the photo activated S-H insertion reaction. Compound **2a** (0.1 M in EtOAc); reagent **5a** (0.2 M in EtOAc); 1 mL reactor volume.

Figure S22. 2D graph between no of experiments performed versus yield (%) for the AI based auto-optimization of photo activated S-H insertion reaction. Compound **2a** (0.1 M in EtOAc); reagent **5a** (0.2 M in EtOAc); 1 mL reactor volume.

Figure S23. AI based system navigated multi-numerical variable complexity and identify the optimal condition for the phtoto activated S-H insertion reaction. Compound **2a** (0.1 M in EtOAc); reagent **5a** (0.2 M in EtOAc); 1 mL reactor volume.

S4.3. General procedure of running AI-optimized condition for longer time for synthesis of compound (6a).

Figure S24. Schematic presentation of continuous flow for the synthesis, of compound **6a.** To prepare the stock solution of compound **2a** (2.20 g, 0.01 mol) was dissolved in ethyl acetate (100 mL) charged in one syringe, another syringe charged with the reagent **5a** (1.9 mL, 0.02 mol) dissolved in ethyl acetate (100 mL). These two syringes connected via pump and out-put is further connected with the T1-mixer and both syringes were running with the 173 μ L/min. flow rate to maintain the stoichiometry and then passed through PFA tubular reactor ($id = 1000$) μ m, $l = 1.3$ m, vol. = 1 mL) under blue light (69W) exposure. The room temperature of the reactor was controlled by fan attached to the bottom of the photochemical reactor. The out-put of the tubular reactor was connected with spring based back pressure regulator (~3 bar) to maintain the evaporation. Then outcoming first one hour of the product mixture **6a** was discarded and next 5 h of the product mixture [52 mL; **2a** (0.546 g)] was collected in HPLC bottle. The EtOAc reaction mixture washed it with 10% aq. NaOH and separated through the separating funnel. The organic EtOAc phase was concentrated under reduced pressure to give

the product **6a** (0.74 g in 5 h, 97.98%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.37 – 7.33 (m, 4H), 7.29 – 7.25 (m, 5H), 4.86 (s, 1H), 3.67 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 170.55, 134.32, 133.16, 133.10, 129.98, 129.14, 128.89, 128.40, 55.73, 52.88. **IR (max):** 3021.35, 2952.59, 1737.18, 1487.9, 1214.19, 829.21 cm-1 . **HRMS (ESI):** *m/z* calcd for **C**₁₅**H**₁₄**CIO**₂**S** $[M+H]^+$ 293.0398, found 293.0404. Verified the analytical data with those reported in the literature.⁴

Space time yield in previous reported batch process ⁴

Productivity $= 130$ mg in 12 h

Productivity (per h):
$$
=\frac{0.130}{12} = 0.011 \text{ g/h}
$$

Space time yield ∶= productivity volume of reactor = 0.011 1 $= 0.011$ g $mL^{-1}h^{-1}$

Figure S25. Scope of substrate for the photo activated S-H insertion reaction. Compound **2** (0.1 M in EtOAc); reagent **5** (0.2 M in EtOAc); 1 mL reactor volume.

S4.3.2. General procedure for scope of substrate for carbene insertion into the S−H bonds of organic aromatic thiol for synthesis of compound 6b−**h.**

Example 18. Methyl 2-((4-bromophenyl)thio)-2-(4-chlorophenyl)acetate **(6b).**

The title compound was synthesised following the general procedure described in section **4.3**, and involve corresponding reactant exchange with compound **2a** and compound **5b** (4 bromobenzenethiol). The crude mixture was concentrated under vacuum and the product was

purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound 6b (0.76 g in 5 h, 79%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.39 – 7.32 (m, 4H), 7.30 – 7.25 (m, 2H), 7.22 – 7.17 (m, 2H), 4.83 (s, 1H), 3.68 (s, 3H). **¹³C NMR (126 MHz, CDCl3)** δ 170.23, 137.70, 134.68, 132.24, 129.94, 128.98, 122.88, 55.62, 52.98. **IR (max):** 3020.98, 1736.81, 1483.63, 1214.01, 817.91, 667.71 cm-1 . **HRMS (ESI):** *m/z* calcd. for **C15H13BrClO2S** [M+H]⁺370.9503, found 370.9509.

Example 19. Methyl 2-(4-bromophenyl)-2-((4-chlorophenyl)thio)acetate **(6c).**

The title compound was synthesised following the general procedure described in section **4.3**, and involve corresponding reactant exchange with compound **2b** and compound **5c** (4 chlorobenzenethiol). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound 6c (0.75 g in 5 h, 78%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.42 (d, *J* = 8.4 Hz, 2H), 7.28 – 7.25 (m, 4H), 7.21 (d, *J* = 8.6 Hz, 2H), 4.81 (s, 1H), 3.66 (s, 3H). **¹³C NMR (126 MHz, CDCl3)** δ 170.15, 134.75, 134.59, 134.47, 131.91, 131.43, 130.26, 129.30, 122.66, 55.79, 52.96. **IR (max):** 3019.95, 2952.20, 1735.81, 1497.43, 1213.23, 817.44, 626.54 cm-1 . **HRMS (ESI):** *m/z* calcd for **C15H13BrClO2S** [M+H]⁺370.9503, found 370.9510.

Example 20. Methyl 2-(4-bromophenyl)-2-((4-fluorophenyl)thio)acetate **(6d).**

The title compound was synthesised following the general procedure described in section **4.3**, and involve corresponding reactant exchange with compound **2b** and compound **5d** (4 fluorobenzenethiol). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.5 (5% ethylacetate/hexane); to give compound **6d** (0.74 g in 5 h, 81%) as a colorless oil. **¹H NMR (500 MHz, CDCl3)** δ 7.42–7.40 (m, 2H), 7.34 – 7.32 (m, 2H), 7.27– 7.24 (m, 2H), 6.96 – 6.92 (m, 2H), 4.77 (s, 1H), 3.64 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 170.25, 164.38, 161.90, 136.37, 136.29, 134.63, 131.81, 130.29, 127.85, 127.82, 122.52, 116.34, 116.13, 56.26, 52.83. **¹⁹F NMR (471 MHz, CDCl3)** δ -111.71.**IR (max):** 3021.30, 1737.68, 1437.42, 1216.36, 828.38, 668.88 cm-1 . **HRMS (ESI):** *m/z* calcd for **C15H13BrFO2S** [M+H]⁺354.9798, found 354.9802.

Example 21. Methyl 2-(4-bromophenyl)-2-(p-tolylthio)acetate **(6e).**

The title compound was synthesised following the general procedure described in section **4.3**, and involve corresponding reactant exchange with compound **2b** and compound **5e** (4 methylbenzenethiol). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound 6e (0.77 g in 5 h, 85%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.42 (d, *J* = 8.5 Hz, 2H), 7.30 – 7.24 (m, 4H), 6.79 (d, *J* = 8.9 Hz, 2H), 4.70 (s, 1H), 3.77 (s, 3H), 3.66 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 170.57, 160.44, 136.48, 135.02, 131.72, 130.36, 123.05, 122.33, 114.63, 56.67, 55.36, 52.75. **IR (max):** 3020.59, 1735.43, 1437.72, 1214.76, 1010.62, 826.89 cm-1 . **HRMS (ESI):** *m/z* calcd for **C16H16BrO2S** [M+H]⁺351.0049, found 351.0055.

Example 22. Methyl 2-(4-bromophenyl)-2-((3-methoxyphenyl)thio)acetate **(6f).**

The title compound was synthesised following the general procedure described in section **4.3**, and involve corresponding reactant exchange with compound **2b** and compound **5f** (3 methoxybenzenethiol). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $\mathbf{R}f = 0.5$ (5% ethylacetate/hexane); to give compound 6f (0.74 g in 5 h, 79%) as a yellow oil. **¹H NMR (500 MHz, CDCl3)** δ 7.44 –7.42 (m, 2H), 7.31– 7.30 (m, 2H), 7.18 – 7.14 (m, 1H), 6.93 – 6.91 (m, 1H), 6.86 – 6.85 (m, 1H), 6.80 – 6.78 (m, 1H), 4.87 (s, 1H), 3.71 (s, 3H), 3.67 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 170.39, 159.74, 134.82, 134.33, 131.82, 130.25, 129.89, 124.70, 122.47, 117.58, 114.29, 55.56, 55.26, 52.90. **IR (max):** 3019.75, 1737.02, 1481.61, 1215.45, 669.75 cm-1 . **HRMS (ESI):** *m/z* calcd for **C16H16BrO3S** [M+H]⁺366.9998, found 366.9993.

Example 23. Methyl 2-(4-bromophenyl)-2-(naphthalen-1-ylthio)acetate **(6g).**

The title compound was synthesised following the general procedure described in section **4.3**, and involve corresponding reactant exchange with compound **2b** and compound **5g** (3 methoxybenzenethiol). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.5 (5% ethylacetate/hexane); to give compound **6g** (0.77 g in 6 h, 77%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.83 (d, *J* = 1.4 Hz, 1H), 7.77 – 7.74 (m, 1H), 7.72 – 7.69 (m, 2H), 7.50 – 7.42 (m, 3H), 7.41 – 7.38 (m, 2H), 7.33 – 7.31 (m, 2H), 4.95 (s, 1H), 3.64 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 170.47, 134.80, 133.56, 132.77, 132.22, 131.88, 130.50, 130.29, 129.72, 128.75, 127.74, 127.66, 126.74, 126.69, 122.55, 55.73, 52.92. **IR (max):** 3053.68, 2951.64, 1738.16, 1489.43, 1212.16, 634.22 cm-1 . **HRMS (ESI):** *m/z* calcd for **C19H16BrO2S** [M+H]⁺387.0049, found 387.0053.

Example 24. Methyl 2-(4-chlorophenyl)-2-((1-phenyl-1H-tetrazol-5-yl)thio)acetate **(6h).**

The title compound was synthesised following the general procedure described in section 4.3, and involve corresponding reactant exchange with compound **2a** and compound **5h** (1-phenyl-1H-tetrazole-5-thiol). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.5 (5% ethylacetate/hexane); to give compound **6h** (0.70 g in 6 h, 75%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.56 – 7.49 (m, 5H), 7.45 – 7.42 (m, 2H), 7.32 – 7.29 (m, 2H), 5.78 (s, 1H), 3.76 (s, 3H). **¹³C NMR (126 MHz, CDCl3)** δ 169.17, 152.44, 135.38, 133.34, 132.35, 130.39, 129.93, 129.92, 129.38, 123.77, 54.07, 53.70. **IR** (v_{max}): 3018.80, 2955.24, 1741.03, 1216.96, 1009.64, 832.24 cm⁻¹. **HRMS (ESI):** m/z calcd for C₁₆H₁₄ClN₄O₂S [M+H]⁺ 361.0521, found 361.0526

Table **S7**. Comparative result for the carbene insertion into S-H bonds of thiols.

Entry	Compound 2a	Reagent 5a	Product 6a	Comparative result
$\mathbf{1}$	LO. О N ₂ СI	SH	о= С	98%, 5.7 min. (our study) $[(CH3CN)4Cu]PF6(5 mol%),$ 12-24 h, 89%
				$\overline{\mathcal{A}}$ Fe(OTf) ₂ (15 mol%), 24-48 h, 35 % 5

S5. Case study-3: Carbene insertion (C-N bond formation) single objective multi-variant autooptimization.

S5.1. Background collection

Sample Preparation: We prepare 0.5 M stock solution of compound **2a** in ethyl acetate, 0.5 M stock solution of reagent **7a** in ethyl acetate and 0.5 M stock solution of product **8a** in ethyl acetate. The three of the solution taken in three different syringes.

Delivery system: The HPLC pumps and syringe pump were directly interfaced to the main computer via an RS-232 interface or LAN. These pumps will help in introducing reactants and reagent solutions into the microreactor with varied flow rate as the central computer's prescribed flow rate (fr). The central computer and the HPLC pump communicated through serial communication using ASCII code to exchange information about flow rate, operational status, and duration. This facilitated the transmission of essential details from the main computer to the pumps, enabling them to commence their operations as required. To conduct our analysis, we utilized an In-line FTIR system. The experimental protocol involved the initial introduction of the solvent, ethyl acetate, for a duration of 10 min. using a syringe pump, during which data was recorded. Subsequently, a previously prepared stock solution of compound **2a** was similarly introduced into the In-line FTIR for 10 min. This process was repeated for the reaction product **8a** and reagent **7a**, each pumped for 10 min. Upon collecting all relevant data, we identified the signature peak present in the product. Using this peak as a reference, we employed a Bayesian optimizer to fine-tune and optimize the reaction conditions for improved results.

Figure S26. In-line IR background analysis of EtOAc, 0.5 M stock solution of **2a**, **7a**, and **8a** in EtOAc.

The distinctive C-N stretching associated with product (**8a**) aligning within the range of 1295 to 1325 cm^{-1} was observed. This specific peak, falling within this range, is designated as the signature peak for our analysis. During the optimization of the reaction through Bayesian methods, this signature peak serves as a pivotal reference point. We utilize it to calculate the area under the curve in the In-line FT-IR spectra, providing a quantitative measure of the area in the forthcoming reaction mixture.

S5.2. General procedure for the auto-optimized synthesis of compound 8a.

Initial steps involved the preparation of stock solutions for compound **2a** (0.1 M in EtOAc) and reagent **7a** (0.3 M in EtOAc), each filled into separate syringes and connected to a syringe pump. The solutions were then directed through a PFA tubular reactor (inner diameter $= 1$ mm, length = 1.3 m, volume = 1 mL) surrounded by a cylindrical-shaped blue LED light source. Once the solution setup was complete, input ranges for variable flow rates, voltages, and current were specified in the Python code designed for the reaction. The Bayesian optimizer systematically explored these varying reaction conditions, aiming to achieve maximum yield. The optimization process involved running 40-44 experiments and the results were tabulated in the optimization table (Table S8).

S5.2.1. Python code for optimizing condition of carbene insertion reaction (C-N bond formation).

```
ab3.py
    1 from os import listdir
    2 from os.path import isfile, join
    3 import serial
    5 import numpy as np
    6 import pandas as pd
    7 import time
    8 from scipy.integrate import trapz
   10 #step1: be sure to the address of the files that the ftir data is exported is matching to line 11 (mypath)
   11 mypath = "C:\\Users\\Admin\\Desktop\\ruchi\\Exp 2024-02-27 13-13"
   12 onlyfiles = [f for f in listdir(mypath) if isfile(join(mypath, f))]
   1314 #step2: make sure that pump and the potentiostat is correctly addressed in the Line 16 and 17
   15 pump 1 = serial.Serial("COM15",9600) #Syringe Pump
   16 port = serial.Serial("COM1",115200)
   17 printer = serial.Serial("COM14", 115200, timeout=1)
   18
   19 r 1=13.36 #radius of syringe used (50ml, 14.25/20ml, 9.6/10ml, 7.25/5ml, 6.03/3ml, 4/3/1ml, 2.39/60ml, 13.36)
   20 pump 1 k=(13.36/r 1)**2
   21
   22 #step 3: grab the lines from 22 to 90 and presss f9
   23 def area under(data.start.end):
         x = np-flip(data.iloc[start:end, 0].to_number())2425
         y = np-flip(data.iloc[start:end, 1].to numpy())26
         area = trapz(v,x)27
         return np.abs(area)
   28
   29 def file namer(num):
   30
         str1 = str(num)31length = int(len((str1)))\text{empty} = \text{``}3233
         for i in range(5-length):
   34empty = empty + '0'35
   36
          return empt+str1
   37
   38
   39 def ftir_extract(filename,init,end):
   40
   41
         filename = filename4243
         temp df = pd.read csv(filename)
         # nump df = temp \overline{df} . to \text{numpy}()44
   45
         area = area under(temp df, init, end)46
         # max peak = np.max(nump df[90:120,1])
   47
         print(area)
```

```
48
49
      return area
50
51
52 def function(flowrate_1,v,i):
53
54
       #set the pumps with the flowrate as the desired flowrate for the function
55
56
      fr_1 = flowrate_1*1000*pump_1_k #ml/min to microliter/min and syringe correction factor
57
      send syr command(f'fr{fr 1}')
58
      time.sleep(0.1)59
60
      #set the com port for potentiostat and set the voltage and current
61
      vol = v62
      curr = i63
      port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                        #to change the voltge we need to use "VOLT 1" command
64
      port.write(('CURR '+str(curr)+'\r\n').encode())
                                                        #to change the current we need to use "CURR 1" command
65
66
67
      #pumps run
68
      time.sleep(0.1)69
      time.sleep(1000)
70
71 def function2():
72
      time.sleep(1000)
73
74
      files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
75
76
      val = 077
78
      #change wavelengths as per product here.
79
      f row=16 #first row of range for wavelength as per IR CSV
80
      1 row=24 #Last row of range for wavelength as per IR CSV
81
82
      val += ftir extract(files[-1],f row,l row)
83
      val+=ftir extract(files[-2],f row,l row)
84
      val+=ftir extract(files[-3],f row,l row)
85
86
      avg_val = val/387
88
      return avg_val
89
90
91 #step 4:grab the Line 93 and f9
92 from skopt.optimizer import Optimizer
93
94
```

```
95 def send syr command(command):
 96
        pump 1.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
 97
        pump 1.flush() # Flush the serial buffer
 98
 99
100 #step5:in line 96 we have to define the range that (flowrate,voltage,current) (from,to) and after (anytime) appllying changes you need to grab the line 96 and f9
101 #flowrates are in ml/min, voltage in V, Current in Ampere
102 bounds = [(0.05, 0.2), (10, 14.5), (4.9, 5.0)]103
104 #step 6: arab the line 100 and f9105 opter =Optimizer(bounds,base estimator='gp',n initial points=3,acq func="EI",random state=np.random.randint(3326))
106
107
108 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated
109 number of cycles = 22
110 results = \tilde{1}111 flowrates 1 = \lceil \rceil112 \text{ vs } = [ ]113 currents = []114
115 product wavelength=True #set to true if product wavelengths being monitored
116
117 if product_wavelength == True:
118 val=1119 else:
120 val=-1121
122123 # Step 8: Test Tubes on Printer
124 USE PRINTER = True
125 REST HEIGHT = 200
126 X HOME = -5
127 Y HOME = 20128 Z HOME = 175
129 DEFAULT_PUMP_TIME="1"
130 # Distance between test tubes
131 X SPACING=20
132 Y SPACING=20
133 # Number of test tubes
134 X ROWS = 11135 Y COLUMNS = 4136
137 def send_cmd(cmd):
138
       print(cmd)139
       printer.write(f"{cmd}\n".encode("ASCII"))
140
141 def move(x=None, y=None, z=None):
```

```
s = "60"142
143
       if x is not None:
144
            s += f''X{x}''145
       if y is not None:
146
           s \leftarrow f''Y\{v\}''147
       if z is not None:
148
            s \leftarrow f''Z{z}''149
       s+= "F5000"
150
151
       send_cmd(s)
152
153 def printer positions():
154
       for j in range(Y COLUMNS):
155
            for i in range(X ROWS):
156
                if jX2 == 1:
157
                   yield (X HOME + (X ROWS - 1 - i) * X SPACING, Y HOME + j * Y SPACING, Z HOME)
                else:158
159
                   yield (X HOME + i * X SPACING, Y HOME + j * Y SPACING, Z HOME)
160
161 # Run this.
162 tube location = list(printer positions())
163
164 time.sleep(2)
165
166 for i in range(number of cycles):
167
       move(*tube location[2*i])
       asked = opter ask()168
       print (asked[0])
169
       function(asked[0],asked[1],asked[2])
170
171
       move(*tube_location[2^*i+1])told = function2()172
173
174
       print(f"area under the curve in the round \{i: .2f\} = \{told: .2f\}")
175
       opter.tell(asked,-told*val)
176
       results.append(told)
177
       flowrates 1.append(asked[0])
178
       vs.append(asked[1])
179
       currents.append(asked[2])
180
181
       dict1 = {"flowrate 1":flowrates 1,"voltages":vs, "currents":currents,"area-results":results}
182
       df2 = pd.DataFrame(idict1)183
       df2.to_csv("output round "+str(i)+".csv")
184
185
186
187 send_syr_command("stop")
                                #turns off syringe pump flow
188
```


Table S8. Auto-optimization table of carbene insertion reaction (C-N bond formation).

Reaction condition: compound **2a** (0.1 M in EtOAc); reagent **7a** (0.3 M in EtOAc); 1 mL reactor volume.

Graph: We have plotted 3D graph of optimization table S8, we have taken flow rate on Xaxis, blue light intensity (watt) on Y-axis and product yield on Z axis.

Figure S27. AI based system to auto-optimize and navigate this complexity and identify the optimal conditions for the photo activated N-H insertion reaction. Compound **2a** (0.1 M in EtOAc); reagent **7a** (0.3 M in EtOAc); 1 mL reactor volume.

Figure S28. 2D graph between no of experiments performed versus yield (%) for the AI based auto-optimization of photo activated N-H insertion reaction. Compound **2a** (0.1 M in EtOAc); reagent **7a** (0.3 M in EtOAc); 1 mL reactor volume.

Figure S29. AI based system navigated multi-numerical variable complexity and identify the optimal conditions for the photo activated N-H insertion reaction. Compound **2a** (0.1 M in EtOAc); reagent **7a** (0.3 M in EtOAc); 1 mL reactor volume.

S5.3. General procedure of running AI optimized condition for longer time for synthesis of compound 8a.

Figure S30. Schematic presentation of continuous flow for the synthesis, of compound **8a.** To prepare the stock solution of compound **2a** (2.20 g, 0.01 mol) was dissolved in ethyl acetate (100 mL) charged in one syringe, another syringe charged with the reagent **7a** (2.9 mL, 0.03 mol) dissolved in ethyl acetate (100 mL). These two syringes connected via pump and out-put is further connected with the T_1 -mixer and both syringes were running with the 46 μ L/min. each flow rate to maintain the stoichiometry and then passed through PFA tubular reactor ($id =$ 1000 μ m, l = 1.3 m, vol. = 1 mL) under blue light (68.0 \pm 2 W) exposure. The room temperature of the reactor was controlled by fan attached to the bottom of the photochemical reactor. The out-put of the tubular reactor was connected with spring based back pressure regulator $(\sim 3 \text{ bar})$ to maintain the evaporation. First one hour of the product mixture was discarded and next 5 h of the product mixture [28 mL; **2a** (0.294 g)] was collected in HPLC bottle The organic EtOAc phase was concentrated under reduced pressure and purified through the regular batch process protocols to give the product **8a** (0.35 g in 5 h, 92 %) as a colourless oil. **¹H NMR (400 MHz,** **CDCl3)** δ 7.43 – 7.40 (m, 2H), 7.30 – 7.27 (m, 2H), 7.11 – 7.07 (m, 2H), 6.71 – 6.67 (m, 1H), 6.52 – 6.49 (m, 2H), 5.03 (s, 1H), 5.00 (s, 1H), 3.69 (s, 3H). **¹³C NMR (126 MHz, CDCl3)** δ 171.86, 145.67, 136.29, 134.17, 129.33, 129.10, 128.67, 118.37, 113.50, 60.12, 52.98. **IR (max):** 3418.02, 3020.09, 1740.08, 1214.36, 688.27 cm-1 . **HRMS (ESI):** *m/z* calcd for $C_15H_15CINO2$ $[M+H]^+$ 276.0786, found 276.0782. Verified the analytical data with those reported in the literature.⁶

Figure S31. Scope of substrate for the photo activated N-H insertion reaction. Compound **2a** (0.1 M in EtOAc); reagent **7a** (0.3 M in EtOAc); 1 mL reactor volume.

S5.3.1. General procedure for scope of substrate for carbene insertion into the N−H bonds of organic aromatic and aliphatic amines for synthesis of compound 8b−**j.**

Example 26. Methyl 2-(benzylamino)-2-(4-chlorophenyl)acetate **(8b).**

The title compound was synthesized following the general procedure described in section 5.3 and involved corresponding reactant exchange with compound **2a** and compound **7b** (benzyl amine). The crude mixture was concentrated under vacuum, and the product was purified by flash chromatography; to give compound **8b** (0.74 g in 5 h, 89%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.34 – 7.22 (m, 9H), 4.36 (s, 1H), 3.70 (d, *J* = 6.2 Hz, 2H), 3.66 (s, 3H), 2.32 (s, 1H). **¹³C NMR (101 MHz, CDCl3)** δ 173.02, 139.28, 136.61, 133.96, 129.05, 128.89, 128.51, 128.31, 127.27, 63.64, 52.36, 51.30. **IR (max):** 3340.60, 2951.52, 1736.67, 1489.77, 1169.20, 769.20 cm-1 . **HRMS (ESI):** *m/z* calcd for **C16H17ClNO²** [M+H]⁺290.0948, found 290.0967.

Example 27. Methyl 2-(4-chlorophenyl)-2-(dibenzylamino)acetate **(8c).**

The title compound was synthesized following the general procedure described in section 5.3 and involved corresponding reactant exchange with compounds **2a** and **7c** (dibenzylamine). The crude mixture was concentrated under vacuum, and the product was purified by flash chromatography; to give compound **8c** (0.79 g in 5 h, 74%) as a colourless liquid. **¹H NMR (400 MHz, CDCl3)** δ 7.34 – 7.21 (m, 14H), 4.57 (s, 1H), 3.77 (s, 3H), 3.73 (d, *J* = 2.9 Hz, 4H). **¹³C NMR (101 MHz, CDCl3)** δ 172.28, 139.32, 135.32, 133.87, 130.26, 128.88, 128.69, 128.48, 127.28, 65.31, 54.35, 51.67. **IR (max):** 3024.08, 1736.91, 1451.25, 1213.67, 688.73 cm-1 . **HRMS (ESI):** *m/z* calcd for **C23H23ClNO²** [M+H]⁺380.1412, found 380.1408.

Example 28. Methyl 2-((5-bromopyrimidin-2-yl)amino)-2-(4-chlorophenyl)acetate **(8d).**

The title compound was synthesized following the general procedure described in section 5.3 and involved corresponding reactant exchange with compound **2a** and compound **7d** (5 bromopyrimidin-2-amine). The crude mixture was concentrated under vacuum, and the product was purified by flash chromatography; to give compound **8d** (0.83 g in 5 h, 83%) as a yellow liquid. **¹H NMR (500 MHz, CDCl3)** δ 8.21 (s, 2H), 7.40 – 7.38 (m, 2H), 7.33 – 7.32 (m, 2H), 6.61 (s, 1H), 5.56 (d, *J* = 6.8 Hz, 1H), 3.74 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 171.30, 159.18, 158.36, 135.38, 134.50, 129.11, 128.84, 107.86, 58.01, 52.93. **IR(max):** 3251.65, 3001.76, 2952.73, 1742.79, 1577.46, 1429.20, 1170.80 cm-1 . **HRMS (ESI):** *m/z* calcd for **C13H12BrClN3O²** [M+H]⁺355.9796, found 355.9792.

Example 29. Methyl 2-(*tert*-butylamino)-2-(4-chlorophenyl)acetate **(8e).**

The title compound was synthesized following the general procedure described in section **4.8.2** and involved corresponding reactant exchange with compound **2a** and compound **7e** (*tert-*butyl amine). The crude mixture was concentrated under vacuum, and the product was purified by flash chromatography; to give compound **8e** (0.56 g in 5 h, 81%) as a colorless oil. **¹H NMR (500 MHz, CDCl3)** δ 7.37 – 7.27 (m, 4H), 4.46 (s, 1H), 3.68 (s, 3H), 2.03 (s, 1H), 1.08 (s, 9H). **¹³C NMR (101 MHz, CDCl3)** δ 175.11, 139.37, 133.50, 128.76, 59.08, 52.58, 51.36, 29.52. **IR (max):** 3341.84, 2928.86, 1736.93, 1488.43, 1167.16, 823.38 cm-1 . **HRMS (ESI):** *m/z* calcd for **C13H19ClNO²** [M+H]⁺256.1099, found 256.1103.

Example 30. Methyl 2-(4-chlorophenyl)-2-(2-(pyridin-4-yl)-1H-benzo[d]imidazol-1 yl)acetate **(8f).**

The title compound was synthesized following the general procedure described in section 5.3 and involved corresponding reactant exchange with compound **2a** and compound **7f** (2- (pyridin-4-yl)-1H-benzo[d]imidazole). The crude mixture was concentrated under vacuum, and the product was purified by flash chromatography; to give compound **8f** (0.92 g in 5 h, 84%) as an off white solid and **mp:** 166-168 °C. ¹H NMR (400 MHz, CDCl₃) δ 8.77 (d, *J* = 6.0 Hz, 2H), 7.88 (d, *J* = 8.1 Hz, 1H), 7.56 – 7.55 (m, 2H), 7.37 – 7.33 (m, 3H), 7.25 – 7.23 (m, 1H), 7.15 – 7.09 (m, 3H), 6.37 (s, 1H), 3.76 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 168.01, 151.50, 150.58, 143.19, 137.46, 135.06, 134.64, 131.44, 129.23, 128.53, 124.32, 123.55, 123.51, 120.76, 120.51, 112.40, 61.38, 53.44. **IR (max):** 2958.15, 1747.03, 1411.75,1212.68, 1004.48 cm-1 . **HRMS (ESI):** *m/z* calcd for **C21H17ClN3O²** [M+H]⁺378.1007, found 378.1009.

Example 31. Methyl 2-(4-chlorophenyl)-2-(indolin-1-yl)acetate **(8g).**

The title compound was synthesized following the general procedure described in section 5.3 and involved corresponding reactant exchange with compound **2a** and compound **7g** (indoline). The crude mixture was concentrated under vacuum, and the product was purified by flash chromatography; $Rf = 0.5$ (30% ethylacetate/hexane); to give compound 8g (0.70 g in 5 h, 81%) as a white solid and **mp:** 105-107 °C. **¹H NMR (400 MHz, CDCl3)** δ 7.39 (s, 4H), 7.13 – 7.06 (m, 2H), 6.76 – 6.72 (m, 1H), 6.47 (d, *J* = 7.9 Hz, 1H), 5.29 (s, 1H), 3.78 (s, 3H), 3.66 (dd, *J* = 17.9, 8.6 Hz, 1H), 3.23 – 3.17 (m, 1H), 3.05 – 2.89 (m, 2H). **¹³C NMR (101 MHz, CDCl3)** δ 171.30, 150.63, 134.33, 133.76, 130.25, 130.03, 128.92, 127.24, 124.77, 118.64, 106.90, 63.21, 52.15, 49.90, 28.20. **IR (max):** 2954.36, 1714.79, 1213.16, 1013.78, 838.25 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H17ClNO²** [M+H]⁺302.0942, found 302.0970.

Example 32. Methyl 2-(4-chlorophenyl)-2-(methyl(tetrahydro-2H-pyran-4-yl)amino)acetate **(8h).**

The title compound was synthesized following the general procedure described in section 5.3 and involved corresponding reactant exchange with compound **2a** and compound **7h** (Nmethyltetrahydro-2H-pyran-4-amine). The crude mixture was concentrated under vacuum, and the product was purified by flash chromatography; to give compound **8h** (0.62 g in 5 h, 75%) as a colourless liquid. **¹H NMR (400 MHz, CDCl3)** δ 7.38 – 7.36 (m, 2H), 7.33 – 7.30 (m, 2H), 4.47 (s, 1H), 4.00 – 3.95 (m, 2H), 3.70 (s, 3H), 3.32 – 3.21 (m, 2H), 2.74 – 2.66 (m, 1H), 2.24 (s, 3H), 1.72 – 1.59 (m, 4H).**¹³C NMR (101 MHz, CDCl3)** 172.32, 135.51, 133.93,

129.92, 128.70, 68.63, 67.57, 67.36, 56.94, 51.93, 33.42, 29.69, 28.64. **IR (max):** 2952.50, 2846.49, 1738.35, 1489.25, 1206.43, 1011.50, 816.53 cm-1 . **HRMS (ESI):** *m/z* calcd for **C15H21ClNO³** [M+H]⁺298.1210, found 298.1230.

Example 33. Methyl 2-(4-chlorophenyl)-2-(diisopropylamino)acetate (**8i**).

The title compound was synthesized following the general procedure described in section **5.3** and involved corresponding reactant exchange with compounds **2a** and **7i** (diisopropylamine). The crude mixture was concentrated under vacuum, and the product was purified by flash chromatography; to give compound **8i** (0.66 g in 5 h, 82%) as a white solid. **¹H NMR (400 MHz, CDCl3)** δ 7.29 – 7.22 (m, 4H), 4.73 (s, 1H), 3.73 (s, 3H), 3.30 – 3.20 (m, 2H), 1.10 (d, *J* = 6.6 Hz, 6H), 0.96 (d, *J* = 6.7 Hz, 6H). **¹³C NMR (126 MHz, CDCl3)** δ 175.62, 138.16, 133.05, 129.78, 128.33, 61.04, 51.69, 45.95, 23.24, 21.55. **IR (max):** 2963.52, 2871.93, 1740.85, 1459.80, 1140.85, 1015.15, 821.93 cm⁻¹. **HRMS (ESI):** m/z calcd for C₁₅H₂₃ClNO₂ [M+H]⁺ 284.1412, found 284.1411.

Example 34. Methyl 2-(((3s,5s,7s)-adamantan-1-yl)amino)-2-(4-chlorophenyl)acetate **(8j).**

The title compound was synthesized following the general procedure described in section **5.3** and involved corresponding reactant exchange with compound **2a** and compound **7j** (adamantly amine). The crude mixture was concentrated under vacuum, and the product was purified by flash chromatography; to give compound **8j** (0.76 g in 5 h, 85%) as a white solid.

¹H NMR (400 MHz, CDCl3) δ 7.37 – 7.26 (m, 4H), 4.57 (s, 1H), 3.67 (s, 3H), 2.04 (d, *J* = 7.0 Hz, 4H), 1.64 – 1.55 (m, 12H). **¹³C NMR (101 MHz, CDCl3)** δ 175.05, 139.49, 133.33, 128.68, 128.63, 56.90, 52.45, 51.31, 43.07, 36.51, 29.56. **IR (max):** 3328.25, 2904.43, 2848.81, 1736.79, 1487.26, 1163.15, 821.61 cm⁻¹. **HRMS (ESI):** m/z calcd for C₁₉H₂₅ClNO₂ [M+H]⁺ 334.1574, found 334.1592.

S6 Case study-4: Carbene insertion (C-C bond formation, cyclopropanation) single objective multi-variant auto-optimization.

5.6.1 Background collection

Sample Preparation: We prepare 0.5 M stock solution of compound **2a** in DCE, 0.5 M stock solution of reagent **9a** in DCE and 0.5 M stock solution of product **10a** in DCE. The three of the solution taken in three different syringes. To conduct our analysis, we utilized an In-line FTIR system. The experimental protocol involved the initial introduction of the solvent, DCE, for a duration of 10 min. using a syringe pump, during which data was recorded. Subsequently, a previously prepared stock solution of compound **2a** was similarly introduced into the In-line FTIR for 10 min. This process was repeated for the reaction product **10a** and reagent **9a**, each pumped for 10 min. Upon collecting all relevant data, we identified the signature peak present in the product. Using this peak as a reference, we employed a Bayesian optimizer to fine-tune and optimize the reaction conditions for improved results.

Figure S32. In-line IR background analysis of DCE, 0.5 M stock solution of **2a**, **9a**, and **10a** in DCE.

The distinctive shifting peak associated with product (**10a**) aligning within the range of 1910 to 1950 cm^{-1} was observed. This specific peak, falling within this range, is designated as the signature peak for our analysis. During the optimization of the reaction through Bayesian methods, this signature peak serves as a pivotal reference point. We utilize it to calculate the area under the curve in the In-line FT-IR spectra, providing a quantitative measure of the area in the forthcoming reaction mixture.

S6.2. General procedure for the auto-optimized synthesis of compound 10a.

Initial steps involved the preparation of stock solutions for compound **2a** (0.1 M in DCE) and reagent **9a** (0.2 M in DCE), each filled into separate syringes and connected to a syringe pump. The solutions were then directed through a PFA tubular reactor (inner diameter $= 1$ mm, length $= 5.0$ m, volume $= 4$ mL) surrounded by a cylindrical-shaped blue LED light source. Once the solution setup was complete, input ranges for variable flow rates, voltages, and current were specified in the Python code designed for the reaction. The Bayesian optimizer systematically explored these varying reaction conditions, aiming to achieve maximum yield. The optimization process involved running 50-60 experiments and the results were tabulated in the optimization table (Table S10).

S6.2.1. Python code for optimizing condition for C-C bond formation (cyclopropanation).

```
ab4.py
    1 from os import listdir
    2 from os.path import isfile, join
    3 import serial
    5 import numpy as np
    6 import pandas as pd
    7 import time
    8 from scipy.integrate import trapz
    \overline{q}10 #step1: be sure to the address of the files that the ftir data is exported is matching to line 11 (mypath)
   11 mypath = "C:\\Users\\Admin\\Desktop\\ruchi\\Exp 2023-10-31 18-27"
   12 onlyfiles = [f for f in listdir(mypath) if isfile(join(mypath, f))]
   131415 #step2: make sure that pump and the potentiostat is correctly addressed in the Line 16 and 17
   16 pump 1 = serial.Serial("COM4",9600) #Harvard Pump
   17 port = serial.Serial("COM1", 115200)
   18 printer = serial.Serial("COM6", 115200, timeout=1)
   19
   20
   21
   22 #step 3: arab the Lines from 22 to 90 and presss f9
   23 def area under(data, start, end):
   24x = np-flip(data.iloc[start:end, 0].to numpy())y = np-flip(data.iloc[start:end, 1].to\_numpy())25
   26
        area = trapz(y,x)27
         return np.abs(area)
   28
   29 def file namer(num):
   30
         str1 = str(num)31length = int(len((str1)))\text{empty} = \cdots3233
          for i in range(5-length):
   34empty = empty + '0'35
   36
          return empt+str1
   37
   38
   39 def ftir extract(filename, init, end):
   40
          filename = filename41
          temp df = pd.read csv(filename)42
   43
         # nump df = temp \overline{df} . to \text{numpy}()44
          area = area under(temp df, init, end)45
         # max\_peak = np.max(nump_df[90:120,1])46
          print(area)
   47
```

```
48
      return area
49
50
51 def function(flowrate 1,v,i):
52
53
       #set the pumps with the flowrate as the desired flowrate for the function
54
55
      fr 1 = flowrate 1 #ml/min
56
      pump_1.write(('irate '+str(fr_1)+' ml/min\r\n').encode())
57
58
      time.sleep(0.1)59
60
      #set the com port for potentiostat and set the voltage and current
61
      vol = v62
      curr = i63
      port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                      #to change the voltge we need to use "VOLT 1" command
64
      port.write(('CURR '+str(curr)+'\r\n').encode())
                                                      #to change the current we need to use "CURR 1" command
65
66
67
      #pumps run
      68
69
      time.sleep(0.1)time.sleep(4800)
70
71
72 def function2(flowrate 1,v,i):
73
     time.sleep(180)
74
75
      files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
76
77
      val = 078
79
      #change wavelengths as per product here.
80
      f_row=9 #first row of range for wavelength as per IR CSV
81
     1 row=19 #Last row of range for wavelength as per IR CSV
82
      val += ftir_extract(files[-1],f_row,l_row)
83
84
      val+=ftir extract(files[-2],f row,l row)
85
      val+=ftir_extract(files[-3],f_row,l_row)
86
87
      avg val = val/388
89
      return avg_val
90
91
92 #step 4:grab the Line 93 and f9
93 from skopt.optimizer import Optimizer
94
```
96 #step5:in line 96 we have to define the range that (flowrate, voltage, current) (from, to) and after (anytime) appllying changes you need to grab the line 96 and f. 97 #flowrates are in ml/min, voltage in V, Current in Ampere 98 bounds = $[(0.05, 0.15), (10, 14.5), (4.9, 5.0)]$ 99 100 101 #step 6: $grad the Line 100 and f9$ 102 opter =0ptimizer(bounds,base estimator='gp',n initial points=3,acq func="EI",random state=np.random.randint(3326)) 103 104 105 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated 106 number of cycles = 22 107 results = 11 108 flowrates $1 = \lceil \rceil$ $109 \text{ vs } = []$ 110 currents = $[1]$ 111 112 product_wavelength=True #set to true if product wavelengths being monitored 113 114 if product wavelength == True: 115 val=1 116 else: 117 $val=-1$ 118 119 120 # Step 8: Test Tubes on Printer 121 USE PRINTER = True 122 REST HEIGHT = 200 $123 X$ HOME = -5 $124 \overline{Y}$ HOME = 20 $125 \overline{Z}$ HOME = 175 126 DEFAULT PUMP TIME="1" 127 # Distance between test tubes 128 X SPACING=20 129 Y SPACING=20 $130 \#$ Number of test tubes $131 X$ ROWS = 11 132 Y COLUMNS = 4 133 134 def send_cmd(cmd): 135 $print(cmd)$ 136 printer.write(f"{cmd}\n".encode("ASCII")) 137 138 def move(x=None, y=None, z=None):

95

```
s = "60"139
140
       if x is not None:
141
           s \leftarrow f''X\{x\}''142
      if y is not None:
143
           s \leftarrow f''Y{y}''if z is not None:
144
145
           s \leftarrow f''Z{z}''146
147
       s+= "F5000"
148
       send cmd(s)149
150 def printer_positions():
151
       for j in range(Y_COLUMNS):
152
           for i in range(X_ROWS):
153
                if j\%2 == 1:
154
                   yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
155
                else:
156
                   yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
157
158 # Run this.
159 tube_location = list(printer_positions())
160
161
162 for i in range(number of cycles):
163
       move(*tube_location[2*i])
164
       asked = opter ask()function(asked[0],asked[1],asked[2])
165
166
       move(*tube location[2*i+1])167
       \text{told} = function2(asked[0],asked[1],asked[2])
168
169
       print(f"area under the curve in the round \{i: .2f\} = \{told: .2f\}')
170
       opter.tell(asked,-told*val)
171
       results.append(told)
172
       flowrates_1.append(asked[0])
173
       vs.append(asked[1])
174
       currents.append(asked[2])
175
       dict1 = {"flowrate_1":flowrates_1,"voltages":vs, "currents":currents,"area-results":results}
176
177
       df2 = pd.DataFrame(dict1)178
       df2.to_csv("output round "+str(i)+".csv")
179
180
181
182 pump_1.write(b'stop\r\n')
183
184
```
185

Table S10. Auto-optimization table of C-C bond formation (cyclopropanation).

Reaction condition: compound **2a** (0.1 M in DCE); reagent **9a** (0.2 M in DCE); 4 mL reactor volume.

Graph:

We have plotted 3D graph of optimization table S10, we have taken flow rate on X-axis, blue light intensity (watt) on Y-axis and product yield on Z axis.

Figure S33. AI based system to auto-optimize and navigate this complexity and identify the optimal conditions for the photo activated cyclopropanation reaction. Compound **2a** (0.1 M in DCE); reagent **9a** (0.2 M in DCE); 4 mL reactor volume.

Figure S34. 2D graph between no of experiments performed versus yield (%) for the AI based auto-optimization of photo activated cyclopropanation reaction. Compound **2a** (0.1 M in DCE); reagent **9a** (0.2 M in DCE); 4 mL reactor volume.

Figure S35. AI based system navigated multi-numerical variable complexity and identify the optimal condition for the photo activated cyclopropanation reaction. Compound **2a** (0.1 M in DCE); reagent **9a** (0.2 M in DCE); 4 mL reactor volume.

S6.3. General procedure for AI optimized carbene insertion into the double bonds of aromatic alkenes for longer run to synthesis compound **10a.**

Figure S36. Schematic presentation of continuous flow for the synthesis, of compound **9a.**

To prepare the stock solution of compound **2a** (2.20 g, 0.01 mol) was dissolved in ethyl acetate (100 mL) charged in one syringe, another syringe charged with the reagent **9a** (2.4 mL, 0.02 mol) dissolved in ethyl acetate (100 mL). These two syringes connected via pump and out-put is further connected with the T-mixer and both syringes were running with the $125 \mu L/min$. flow rate to maintain the stoichiometry and then passed through PFA tubular reactor ($id = 1000$) μ m, l = 5 m, vol. = 4 mL) under blue light (69W) exposure. The room temperature of the reactor was controlled by fan attached to the bottom of the photochemical reactor. The out-put of the tubular reactor was connected with spring based back pressure regulator $(\sim 3 \text{ bar})$ to maintain the evaporation. First one hour of the product mixture was discarded and next 5 h of the product mixture [37.5 mL; **2a** (0.393 g)] was collected in HPLC bottle. The organic EtOAc phase was concentrated under reduced pressure to give the product **10a** (0.507 g in 5 h, 95%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.12 – 7.07 (m, 5H), 6.97 – 6.93 (m, 2H), 6.79 – 6.77 (m, 2H), 3.67 (s, 3H), 3.11 (dd, *J* = 9.3, 7.4 Hz, 1H), 2.14 (dd, *J* = 9.3, 5.0 Hz, 1H), 1.84 (dd, *J* = 7.3, 5.0 Hz, 1H). **¹³C NMR (101 MHz, CDCl3)** δ 173.99, 135.99, 133.56, 133.33, 133.07, 131.63, 129.46, 128.15, 128.07, 128.02, 126.68, 52.80, 36.82, 33.31, 20.47. **IR (max):** 3024.29, 2953.82, 1716.75, 1494.38, 1213.56, 825.68 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H16ClO²** $[M+H]^+$ 286.0833, found 286.0842. Verified the analytical data with those reported in the literature.⁷

Space time yield in previous reported batch process⁸

Productivity $= 100.4$ mg in 12 h

Productivity (per h):
$$
=\frac{0.100}{12} = 0.008
$$
 g/h

Space time yield ∶= productivity volume of reactor

$$
= \frac{0.008}{3} = 0.0026 \text{ g } mL^{-1} h^{-1}
$$

Figure S37. Scope of substrate for the photo activated cyclopropanation reaction. Compound **2a** (0.1 M in DCE); reagent **9a** (0.2 M in DCE); 4 mL reactor volume.

S6.3.1. General procedure for scope of substrate for synthesis of compound 10b−**i.**

Example 36. Methyl 1-(4-chlorophenyl)-2-(4-fluorophenyl)cyclopropane-1-carboxylate **(10b).**

The title compound was synthesised following the general procedure described in section 6.3, and involve corresponding reactant exchange with compound **2a** and compound **9b** (1-fluoro-

4-vinylbenzene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.5 (5% ethylacetate/hexane); to give compound **10b** (0.37 g in 5 h, 65%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.13 –7.10 (m, 2H), 6.96 –6.93 (m, 2H), 6.81 – 6.71 (m, 4H), 3.66 (s, 3H), 3.09 (dd, *J* = 9.3, 7.3 Hz, 1H), 2.13 (dd, *J* = 9.4, 5.1 Hz, 1H), 1.78 (dd, *J* = 7.3, 5.1 Hz, 1H). **¹³C NMR (101 MHz, CDCl3)** δ 173.83, 162.92, 160.48, 133.34, 133.28, 133.20, 131.75, 129.57, 129.49, 128.17, 115.07, 114.85, 52.81, 36.65, 32.50, 20.55. **¹⁹F NMR (471 MHz, CDCl3)** δ -114.38 (s). **IR (max):** 3021.76, 1715.56, 1437.27, 1214.76, 836.50 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H15ClFO2** [M+H]⁺305.0739, found 305.0748.

Example 37. Methyl 1-(4-chlorophenyl)-2-(4-methoxyphenyl)cyclopropane-1-carboxylate **(10c).**

The title compound was synthesised following the general procedure described in section 6.3, and involve corresponding reactant exchange with compound **2a** and compound **9c** (1 methoxy-4-vinylbenzene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound **10c** (0.375 g in 5 h, 63%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.11 – 7.08 (m, 2H), 6.97 – 6.94 (m, 2H), 6.70 – 6.68 (m, 2H), 6.64 – 6.61(m, 2H), 3.68 (s, 3H), 3.64 (s, 3H), 3.08 – 3.04 (m, 1H), 2.13 – 2.10 (m, 1H), 1.78 – 1.75 (m, 1H).**¹³C NMR (101 MHz, CDCl3)** δ 190.83, 173.95, 158.31, 133.69, 133.32, 132.89, 132.03, 131.69, 130.08, 129.07, 128.51, 127.99, 127.84, 114.37, 113.42, 55.22, 55.13, 52.63, 36.42, 32.81, 20.43. **IR (max):** 3020.53,

1714.16, 1437.97, 1214.91, 833.50 cm-1 . **HRMS (ESI):** *m/z* calcd for **C18H18ClO3** [M+H]⁺ 317.0939, found 317.0942.

Example 38. Methyl 1-(4-bromophenyl)-2-phenylcyclopropane-1-carboxylate **(10d).**

The title compound was synthesised following the general procedure described in section 6.3, and involve corresponding reactant exchange with compound **2b** and compound **9a** (styrene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound 10d (0.494 g in 5 h, 80%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.23 (d, *J* = 8.4 Hz, 2H), 7.08 – 7.05 (m, 3H), 6.88 (d, *J* = 8.4 Hz, 2H), 6.77 – 6.75 (m, 2H), 3.63 (s, 3H), 3.10 (t, *J* = 8.3 Hz, 1H), 2.12 (dd, *J* = 9.3, 5.0 Hz, 1H), 1.82 (dd, *J* = 7.2, 5.1 Hz, 1H). **¹³C NMR (101 MHz, CDCl3)** δ 173.78, 135.88, 134.03, 133.64, 130.94, 128.08, 127.97, 126.63, 121.26, 52.73, 36.82, 33.21, 20.37. **IR (max):** 3021.33, 1715.74, 1491.81, 1214.63, 668.65 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H16BrO²** [M+H]⁺331.0328, found 331.0337.

Example 39. Methyl 1-(4-fluorophenyl)-2-phenylcyclopropane-1-carboxylate **(10e).**

The title compound was synthesised following the general procedure described in section 6.3, and involve corresponding reactant exchange with compound **2c** and compound **9a** (styrene).

The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound 10e (0.370 g in 6 h, 73%) as a colorless oil. **¹H NMR (500 MHz, CDCl3)** δ 7.05 – 7.01 (m, 3H), 6.97 – 6.94 (m, 2H), 6.78 – 6.73 (m, 4H), 3.59 (s, 3H), 3.10 (dd, *J* = 9.3, 7.3 Hz, 1H), 2.12 (dd, *J* = 9.3, 5.0 Hz, 1H), 1.82 (dd, *J* = 7.3, 5.0 Hz, 1H). **¹³C NMR (101 MHz, CDCl3)** δ 173.92, 162.89, 160.45, 135.99, 133.49, 133.41, 130.66, 130.63, 127.99, 127.76, 126.41, 114.67, 114.46, 52.46, 36.54, 33.09, 20.36. **¹⁹F NMR (377 MHz, CDCl3)** δ -114.84. **IR (max):** 3023.59, 2954.03, 1715.89, 1510.89, 1216.92 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H16FO2** [M+H]⁺271.1129, found 271.1139.

Example 40. Methyl 1-(4-methoxyphenyl)-2-phenylcyclopropane-1-carboxylate **(10f).**

The title compound was synthesised following the general procedure described in section **6.3**, and involve corresponding reactant exchange with compound **2d** and compound **9a** (styrene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound 10f (0.403 g in 5 h, 76%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.04 – 7.00 (m, 3H), 6.92 – 6.90 (m, 2H), 6.76 – 6.73 (m, 2H), 6.62 (d, *J* = 8.6 Hz, 2H), 3.62 (s, 3H), 3.59 (s, 3H), 3.06 (t, *J* = 8.2 Hz, 1H), 2.11 – 2.07 (m, 1H), 1.81 – 1.71 (m, 1H). **¹³C NMR (101 MHz, CDCl3)** δ 174.64, 158.56, 136.59, 133.03, 128.21, 127.82, 126.87, 126.37, 113.26, 55.07, 52.63, 36.79, 33.30, 20.81 **IR (max):** 3028.49, 2952.42, 1714.73, 1513.38, 1247.84, 934.88 cm-1 . **HRMS (ESI):** *m/z* calcd for **C18H19O3** [M+H]⁺283.1329, found 283.1335.

Example 41. Methyl 1-(4-nitrophenyl)-2-phenylcyclopropane-1-carboxylate **(10g).**

The title compound was synthesised following the general procedure described in section 6.3, and involve corresponding reactant exchange with compound **2e** and compound **9a** (styrene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound 10g (0.373 g in 5 h, 67%) as a colorless oil. **¹H NMR (500 MHz, CDCl3)** δ 7.99 – 7.97 (m, 2H), 7.21– 7.18 (m, 2H), 7.09 – 7.07 (m, 3H), 6.80 – 6.7 (m, 2H), 3.68 (s, 3H), 3.21 (dd, *J* = 9.3, 7.4 Hz, 1H), 2.22 (dd, *J* = 9.3, 5.2 Hz, 1H), 1.96 (dd, *J* = 7.4, 5.2 Hz, 1H). **¹³C NMR (101 MHz, CDCl3)** δ 172.97, 146.94, 142.76, 135.21, 132.89, 128.23, 128.01, 127.06, 122.98, 52.94, 37.04, 33.64, 20.06. **IR (max):** 3023.03, 2953.82, 1720.22, 1519.83, 1214.04 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H16NO4** [M+H]⁺298.1074, found 298.1082.

Example 42. Methyl 2-phenyl-1-(2,4,5-trifluorophenyl)cyclopropane-1-carboxylate **(10h).**

The title compound was synthesised following the general procedure described in section 6.3, and involve corresponding reactant exchange with compound **2k** and compound **9a** (styrene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound 10h (0.368 g in 5 h, 64%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.11 – 7.09 (m, 3H), 6.88 – 6.85 (m, 3H), 6.67 – 6.60 (m, 1H), 3.68 (s, 3H), 3.22 (dd, *J* = 9.3, 7.6 Hz, 1H), 2.10 (dd, *J* = 9.4, 5.3 Hz, 1H), 1.86 (dd, *J* = 7.5, 5.4 Hz, 1H). **¹³C NMR (126 MHz, CDCl3)** δ 172.59, 158.68, 158.62, 156.71, 156.64, 150.53, 150.42, 150.32, 148.62, 148.53, 148.43, 148.32, 147.15, 147.13, 147.05, 147.03, 145.50, 145.21, 145.18, 145.11, 145.08, 135.62, 135.19, 129.30, 128.13, 127.94, 127.89, 127.17, 126.94, 120.23, 120.19, 120.08, 120.04, 119.60, 119.56, 119.51, 119.47, 119.43, 105.40, 105.24, 105.18, 105.02, 52.75, 52.10, 33.60, 33.10, 32.27, 19.72, 18.86. **¹⁹F NMR (471 MHz, CDCl3)** δ -113.59, -134.16, -134.20, -143.40, -143.44, -143.47. **IR (max):** 3027.15, 2926.40, 1725.42, 1516.46, 1264.81, 885.38 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H14F3O2** [M+H]⁺307.0940, found 307.0949.

The title compound was synthesised following the general procedure described in section 6.3, and involve corresponding reactant exchange with compound **2l** and compound **9a** (styrene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.5$ (5% ethylacetate/hexane); to give compound 10i (0.395 g in 5 h, 79%) as a colorless oil. **¹H NMR (300 MHz, CDCl3)** δ 7.12 – 7.09 (m, 3H), 7.05 – 7.00 (m, 5H), 6.78 – 6.74 (m, 2H), 4.19 – 4.06 (m, 2H), 3.09 (dd, *J* = 9.3, 7.3 Hz, 1H), 2.11 (dd, *J* = 9.3, 4.9 Hz, 1H), 1.86 (dd, *J* = 7.3, 4.9 Hz, 1H), 1.17 (t, *J* = 7.1 Hz, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 173.77, 136.59, 134.99, 132.05, 128.18, 127.80, 127.72, 127.02, 126.38, 61.33, 37.73, 33.04, 20.27, 14.30. **IR (max):** 3028.05, 2983.04, 1711.52, 1451.75, 1252.14, 1164.61 cm-1 . **HRMS (ESI):** *m/z* calcd for **C18H19O2** [M+H]⁺267.1380, found 267.1391.

Table S11. Comparative result for C-C bond formation (cyclopropanation).

S7 Case study-5: Carbene insertion (C-C bond formation, cyclopropenation) single objective multi-variant auto-optimization.

S7.1. Background collection

Sample Preparation: We prepare 0.5 M stock solution of compound **2a** in DCE, 0.5 M stock solution of reagent **11a** in DCE and 0.5 M stock solution of product **12a** in DCE. The three of the solution taken in three different syringes.

To conduct our analysis, we utilized an In-line FTIR system. The experimental protocol involved the initial introduction of the solvent, DCE, for a duration of 10 min. using a syringe pump, during which data was recorded. Subsequently, a previously prepared stock solution of compound **2a** was similarly introduced into the In-line FTIR for 10 min. This process was repeated for the reaction product **12a** and reagent **11a**, each pumped for 10 min. Upon collecting all relevant data, we identified the signature peak present in the product. Using this peak as a reference, we employed a Bayesian optimizer to fine-tune and optimize the reaction conditions for improved results.

Figure S38. In-line IR background analysis of DCE, 0.5 M stock solution of **2a**, **11a**, and **12a** in DCE.
The distinctive shifting peak associated with product (**12a**) aligning within the range of 1730 to 1770 cm^{-1} was observed. This specific peak, falling within this range, is designated as the signature peak for our analysis. During the optimization of the reaction through Bayesian methods, this signature peak serves as a pivotal reference point. We utilize it to calculate the area under the curve in the In-line FT-IR spectra, providing a quantitative measure of the area in the forthcoming reaction mixture.

S7.2. General procedure for the auto-optimized synthesis of compound 12a.

In our approach we are employing a Python-coded based Bayesian optimization strategy for further refinement. Initial steps involved the preparation of stock solutions for compound **2a** (0.1 M in DCE) and reagent **11a** (0.2 M in DCE), each filled into separate syringes and connected to a syringe pump. The solutions were then directed through a PFA tubular reactor (inner diameter $= 1$ mm, length $= 5.1$ m, volume $= 4$ mL) surrounded by a cylindrical-shaped blue LED light source. Once the solution setup was complete, input ranges for variable flow rates, voltages, and current were specified in the Python code designed for the reaction. The Bayesian optimizer systematically explored these varying reaction conditions, aiming to achieve maximum yield. The optimization process involved running 50-60 experiments and the results were tabulated in the optimization table (Table S12).

S7.2.1. Python code for optimizing condition of C-C bond formation, (cyclopropenation)

```
□ ab5.py 因
    1 from os import listdir
    2 from os.path import isfile, join
    3 import serial
    5 import numpy as np
    6 import pandas as pd
    7 import time
    8 from scipy.integrate import trapz
   10 #step1: be sure to the address of the files that the ftir data is exported is matching to line 11 (mypath)
   11 mypath = "C:\\Users\\Admin\\Desktop\\ruchi\\Exp 2023-11-04 15-53"
   12 onlyfiles = [f for f in listdir(mypath) if isfile(join(mypath, f))]
   1314
   15 #step2: make sure that pump and the potentiostat is correctly addressed in the line 16 and 17
   16 pump 1 = serial.Serial("COM4",9600) #Harvard Pump
   17 port = serial.Serial("COM1", 115200)
   18 printer = serial.Serial("COM6", 115200, timeout=1)
   19
   20
   21
   22 #step 3: grab the lines from 22 to 90 and presss f9
   23 def area under(data, start, end):
   x = np-flip(data.iloc[start:end, 0].to_number())25
         y = np-flip(data.iloc[start:end,1].to(numpy())26
         area = trapz(y,x)27
         return np.abs(area)
   28
   29 def file namer(num):
   30
         str1 = str(num)31length = int(len((str1)))\frac{1}{2} empt = \frac{1}{2}3233
         for i in range(5-length):
   34
              empty = empty + '0'35
   36
         return empt+str1
   37
   38
   39 def ftir extract(filename, init, end):
         filename = filename40
   41
   42
        temp df = pd.read csv(filename)
         # number = 1 nump df = temp_df. to numpy()
   43
   44area = area under(temp df, init, end)
         # max\_peak = np.max(nump_df[90:120,1])45
   46
         print(area)
   47
```

```
48
      return area
49
50
51 def function(flowrate 1,v,i):
52
53
       #set the pumps with the flowrate as the desired flowrate for the function
54
55
      fr 1 = flowrate 1 #ml/min
56
      pump_1.write(('irate '+str(fr_1)+' ml/min\r\n').encode())
57
58
      time.sleep(0.1)59
60
      #set the com port for potentiostat and set the voltage and current
61
      vol = v62
      curr = i63
      port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                        #to change the voltge we need to use "VOLT 1" command
      port.write('CURR'+str(curr)+'\r\n), encode())#to change the current we need to use "CURR 1" command
64
65
66
67
      #pumps run
68
      pump 1.write((b'irun\n\n\rangle r\n\n\n)69
      time.sleep(0.1)70
      time.sleep(4800)
71
72 def function2(flowrate 1,v,i):
73
      time.sleep(180)
74
75
      files = [f for f in listdir(mypath) if isfile(join(mypath, f))]76
77
      val = 078
79
      #change wavelengths as per product here.
80
      f row=13 #first row of range for wavelength as per IR CSV
      1 row=21 #Last row of range for wavelength as per IR CSV
81
82
83
      val += ftir extract(files[-1],f row,l row)
84
      val+=ftir extract(files[-2],f row,l row)
85
      val+=ftir_extract(files[-3],f_row,1_row)
86
87
      avg_val = val/388
89
      return avg val
90
9192 #step 4:grab the Line 93 and f9
93 from skopt.optimizer import Optimizer
94
```
 -95 96 #step5:in line 96 we have to define the range that (flowrate,voltage,current) (from,to) and after (anytime) appllying changes you need to grab the line 96 an 97 #flowrates are in ml/min, voltage in V, Current in Ampere 98 bounds = $[(0.05, 0.15), (10, 14.5), (4.9, 5.0)]$ 99 100 101 #step 6: $qrab$ the $line$ 100 and $f9$ 102 opter =0ptimizer(bounds,base estimator='gp',n initial points=3,acq func="EI",random state=np.random.randint(3326)) 103 104 105 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initi 106 number of cycles = 22 107 results = $\boxed{1}$ 108 flowrates $1 = []$ $109 \text{ vs } = []$ 110 currents = $[$] 111 112 product wavelength=True #set to true if product wavelengths being monitored 113 114 if product wavelength == True: 115 $\sqrt{val} = 1$ 116 else: 117 $val=-1$ 118 119 120 # Step 8: Test Tubes on Printer 121 USE PRINTER = True 122 REST HEIGHT = 200 123 X HOME = -5 124 Y HOME = 20 $125 Z HOME = 175$ 126 DEFAULT PUMP TIME="1" 127 # Distance between test tubes 128 X SPACING=20 129 Y SPACING=20 130 # Number of test tubes $131 X$ ROWS = 11 132 Y COLUMNS = 4 133 134 def send cmd(cmd): 135 print(cmd) 136 printer.write(f"{cmd}\n".encode("ASCII")) 137

138 def move(x=None, y=None, z=None):

```
139
       s = "G0"if x is not None:
140
141
            s \leftarrow f''X\{x\}''142
        if y is not None:
143
           s \leftarrow f''Y\{y\}''144
       if z is not None:
145
            s \leftarrow f''Z{z}''146
147
        s+= "F5000"
148
        send_cmd(s)
149
150 def printer positions():
151
        for j in range(Y COLUMNS):
152
            for i in range(X_ROWS):
153
                 if jX2 == 1:154
                    yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
155
                else:156
                    yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
157
158 # Run this.
159 tube location = list(printer positions())160
161
162 for i in range(number_of_cycles):
163
        move(*tube_location[2*i])
164
        asked = opter ask()function(asked[0],asked[1],asked[2])
165
166
        move(*tube_location[2*i+1])
167
        \text{told} = function2(asked[0], asked[1], asked[2])
168
169
        print(f"area under the curve in the round \{i: .2f\} = \{told: .2f\}")
170
        opter.tell(asked,-told*val)
171
        results.append(told)
172
        flowrates 1.append(asked[0])
173
        vs.append(asked[1])
174
        currents.append(asked[2])
175
176
        dict1 = {"flowrate_1":flowrates_1,"voltages":vs, "currents":currents,"area-results":results}
177
        df2 = pd.DataFrame(idict1)178
        df2.to csv("output round "+str(i)+".csv")
179
180
181
182 pump_1.write(b'stop\r\n')
183
184
```
185

Table S12. Auto-optimization table of C-C bond formation, (cyclopropenation)

Reaction condition: compound **2a** (0.1 M in DCE); reagent **11a** (0.2 M in DCE); 4 mL reactor volume.

Graph:

We have plotted 3D graph of optimization table S12, we have taken flow rate on X-axis, blue light intensity (watt) on Y-axis and product yield on Z axis.

Figure S39. AI based system to auto-optimize and navigate this complexity and identify the optimal conditions for the photo activated cyclopropenation reaction. Compound **2a** (0.1 M in DCE); reagent **11a** (0.2 M in DCE); 4 mL reactor volume.

Figure S40. 2D graph between no of experiments performed versus yield (%) for the AI based auto-optimization of photo activated cyclopropenation reaction. Compound **2a** (0.1 M in DCE); reagent **11a** (0.2 M in DCE); 4 mL reactor volume.

Figure S41. AI based system navigated multi-numerical variable complexity and identify the optimal condition for the photo activated cyclopropenation reaction. Compound **2a** (0.1 M in DCE); reagent **11a** (0.2 M in DCE); 4 mL reactor volume.

S7.3. General procedure for AI optimized carbene insertion into the triple bonds of aromatic alkynes for synthesis of compound 12a

Figure S42. Schematic presentation of continuous flow for the synthesis, of compound **12a.**

To prepare the stock solution of compound **2a** (2.20 g, 0.01 mol) was dissolved in ethyl acetate (100 mL) and connected with pump. Another pump was connected with the reagent **11a** (2.3 mL, 0.02 mol) dissolved in ethyl acetate (100 mL). These two pump out-put is further connected with the T_1 -mixer and pumps were running with the flow rate 50 μ L/min.each to maintain the stoichiometry and then passed through PFA tubular reactor (id = 1000 μ m, l = 5 m, vol. $=$ 4 mL) under blue light (68.581 W) exposure. The room temperature of the reactor was controlled by fan attached to the bottom of the photochemical reactor. The out-put of the tubular reactor was connected with spring based back pressure regulator $(\sim 3 \text{ bar})$ to maintain the evaporation. First one hour of the product mixture was discarded and next 5 h of the product mixture [30 mL; **2a** (0.315 g)] was collected in HPLC bottle. The organic EtOAc phase was concentrated under reduced pressure to give the product **12a** (0.410 g in 5 h, 96%) as a yellow oil. **¹H NMR (400 MHz, CDCl3)** δ 7.59 – 7.57 (m, 2H), 7.42 – 7.39 (m, 3H), 7.34 – 7.31 (m, 2H), 7.25 – 7.22 (m, 2H), 7.17 (s, 1H), 3.70 (s, 3H). **¹³C NMR (126 MHz, CDCl3)** δ 174.65, 139.48, 132.32, 130.25, 129.94, 129.68, 129.01, 128.23, 125.11, 117.09, 99.86, 52.32, 32.98. **IR** (v_{max}): 3021.78, 1720.27, 1595.83, 1490.51, 1214.17, 830.32 cm⁻¹. **HRMS (ESI):** *m/z* calcd for **C17H14ClO²** [M+H]⁺285.0677, found 285.0686. Verified the analytical data with those reported in the literature.¹⁵

Space time yield in previous reported batch process ¹⁵

Productivity $= 67$ mg in 16 h

Productivity (per h):
$$
=\frac{0.067}{16} = 0.0041
$$
 g/h

Space time yield ∶= productivity volume of reactor

$$
= \frac{0.0041}{2} = 0.002 \text{ g} mL^{-1} h^{-1}
$$

Figure S43. Scope of substrate for the photo activated cyclopropenation reaction. Compound **2a** (0.1 M in DCE); reagent **11a** (0.2 M in DCE); 4 mL reactor volume.

S.7.3.1. General procedure for scope of substrate for carbene insertion into the S−H bonds of organic aromatic thiol for synthesis of compound 12b-12h.

Example 45. Methyl 1-(4-chlorophenyl)-2-(3-fluorophenyl)cycloprop-2-ene-1-carboxylate **(12b).**

The title compound was synthesised following the general procedure described in section 7.3, and involve corresponding reactant exchange with compound **2a** and compound **11b** (1 ethynyl-3-fluorobenzene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.4$ (5% ethylacetate/hexane); to give compound **12b** (0.410 g in 5 h, 90%) as a yellow oil. **¹H NMR (500 MHz, CDCl3)** δ 7.42 – 7.35 (m, 2H), 7.32 – 7.23 (m, 6H), 7.12 – 7.08 (m, 1H), 3.71 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 174.26, 164.08, 161.62, 139.02, 132.52, 130.72, 130.64, 129.59, 129.28, 128.32, 127.11, 125.66, 125.64, 117.45, 117.24, 116.60, 116.38, 101.44, 52.40, 33.28. **¹⁹F NMR (471 MHz, CDCl3)** δ -112.83 (s). **IR (max):** 3021.73, 1726.97, 1587.32, 1214.51, 1014.81 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H13ClFO2** [M+H]⁺303.0583, found 303.0597.

Example 46. Methyl 1-(4-bromophenyl)-2-phenylcycloprop-2-ene-1-carboxylate **(12c).**

The title compound was synthesised following the general procedure described in section 7.3, and involve corresponding reactant exchange with compound **2b** and compound **11a** (ethynylbenzene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.4 (5% ethylacetate/hexane); to give compound **12c** (0.440 g in 5 h, 89%) as a colorless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.59 – 7.57 (m, 2H), 7.42 – 7.39 (m, 3H), 7.33 (d, *J* = 12.0 Hz, 2H), 7.24 (d, *J* = 8.5 Hz, 2H), 7.17 (s, 1H), 3.70 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 174.57, 140.01, 131.18, 130.28, 130.07, 129.95, 129.03, 125.09, 120.45, 117.04, 99.78, 52.34, 33.06. **IR (max):** 3136.19, 2950.74, 1719.37, 1587.93, 1216.09, 629.14 cm-1 . **HRMS (ESI):** *m/z* calcd for C17H14BrO2 [M+H]+ 329.0172, found 329.0180.

Example 47. Methyl 1-(4-fluorophenyl)-2-phenylcycloprop-2-ene-1-carboxylate **(12d).**

The title compound was synthesised following the general procedure described in section 7.3, and involve corresponding reactant exchange with compound **2c** and compound **11a** (ethynylbenzene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.4 (5% ethylacetate/hexane); to give compound **12d** (0.302 g in 5 h, 75%) as a yellow oil. **¹H NMR (500 MHz, CDCl3)** δ 7.64 – 7.62 (m, 2H), 7.47 – 7.38 (m, 5H), 7.22 (s, 1H), 7.01 – 6.98 (m, 2H), 3.73 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 174.96, 162.85, 160.42, 136.79, 130.22, 129.95, 129.90, 129.04, 125.30, 117.41, 115.07, 114.86, 100.23, 52.33, 32.95. **¹⁹F NMR (377 MHz, CDCl3)** δ -116.21**. IR (max):** 3024.19, 2952.42, 1718.44, 1507.81, 1217.41, 1019.92, 837.24 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H14FO2** [M+H]⁺269.0972, found 269.0990.

Example 48. Methyl 1-(4-methoxyphenyl)-2-phenylcycloprop-2-ene-1-carboxylate **(12e).**

The title compound was synthesised following the general procedure described in section 7.3, and involve corresponding reactant exchange with compound **2d** and compound **11a** (ethynylbenzene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.4 (5% ethylacetate/hexane); to give compound **12e** (0.380 g in 5 h, 90%) as a yellow oil. **¹H NMR (400 MHz, CDCl3)** δ 7.60 – 7.58 (m, 2H), 7.40 – 7.30 (m, 5H), 7.18 (s, 1H), 6.81 (d, *J* = 8.7 Hz, 2H), 3.72 (s, 3H), 3.68 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 175.36, 158.32, 133.16, 130.02, 129.93, 129.40, 128.96, 125.59, 117.71, 113.62, 100.63, 55.25, 52.23. **IR (max):** 3021.06, 1718.02, 1606.03, 1511.72, 1214.64 cm-1 . **HRMS (ESI):** *m/z* calcd for **C18H17O3** [M+H]⁺281.1172, found 281.1185.

Example 49. Methyl 1-(4-nitrophenyl)-2-phenylcycloprop-2-ene-1-carboxylate **(12f).**

The title compound was synthesised following the general procedure described in section 7.3, and involve corresponding reactant exchange with compound **2e** and compound **11a** (ethynylbenzene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.4 (5% ethylacetate/hexane); to give compound **12f** (0.390 g in 5 h, 88%) as a yellow oil. **¹H NMR (400 MHz, CDCl3)** δ 8.16 – 8.13 (m, 2H), 7.60 – 7.56 (m, 4H), 7.47 – 7.44 (m, 3H), 7.19 (s, 1H), 3.73 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 173.75, 148.59, 146.45, 130.63, 129.99, 129.13, 129.05, 124.45, 123.33, 116.18, 98.99, 52.46, 33.25. **IR (max):** 3022.46, 2925.68, 1722.41, 1520.33, 1215.42 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H14NO⁴** [M+H]⁺296.0917, found 296.0927.

Example 50. Methyl 2-(4-fluorophenyl)-1-(4-methoxyphenyl)cycloprop-2-ene-1-carboxylate **(12g).**

The title compound was synthesised following the general procedure described in section 7.3, and involve corresponding reactant exchange with compound **2a** and compound **11c** (1 ethynyl-4-fluorobenzene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; $Rf = 0.4$ (5% ethylacetate/hexane); to give compound **12g** (0.385 g in 5 h, 86%) as a yellow oil. **¹H NMR (400 MHz, CDCl3)** δ 7.60 – 7.58 (m, 2H), 7.40 – 7.30 (m, 5H), 6.81 (d, *J* = 8.8 Hz, 2H), 3.72 (s, 3H), 3.68 (s, 3H). **¹³C NMR (101 MHz, CDCl3)** δ 175.36, 158.32, 133.16, 130.02, 129.93, 129.40, 128.96, 125.59, 117.71, 113.62, 100.63, 55.25, 52.23. **¹⁹F NMR (376 MHz, CDCl3)** δ -110.11, **IR (max):** 2954.04, 2844.40, 1723.50, 1602.75, 1247.68, 1029.28 cm-1 . **HRMS (ESI):** *m/z* calcd for **C18H16FO³** [M+H]⁺ 299.1078, found 299.1089.

Example 51. Methyl 2-phenyl-1-(2,4,5-trifluorophenyl)cycloprop-2-ene-1-carboxylate **(12h).**

The title compound was synthesised following the general procedure described in section 7.3, and involve corresponding reactant exchange with compound **2k** and compound **11a** (ethynylbenzene). The crude mixture was concentrated under vacuum and the product was purified by flash chromatography; **R***f* = 0.4 (5% ethylacetate/hexane); to give compound **12h** (0.408 g in 5 h, 89%) as a yellow oil. **¹H NMR (500 MHz, CDCl3)** δ 7.66 – 7.65 (m, 2H), 7.48 – 7.42 (m, 3H), 7.22 (s, 1H), 7.03 – 6.98 (m, 1H), 6.93 – 6.88 (m, 1H), 3.71 (s, 3H). **¹³C NMR (176 MHz, CDCl3)** δ 174.06, 157.56, 156.13, 149.99, 148.57, 147.43, 145.97, 130.64, 130.05, 129.14, 125.39, 125.29, 124.77, 118.69, 117.83, 117.75, 105.78, 105.62, 105.50, 98.98, 52.69, 29.83, 29.28. **¹⁹F NMR (471 MHz, CDCl3)** δ -115.94, -115.96, -135.30, -135.34, -142,94, - 142.98, -143.01**. IR (max):** 3071.13, 2956.10, 1724.39, 1512.59, 1247.95, 880.71 cm-1 . **HRMS (ESI):** *m/z* calcd for **C17H12F3O2** [M+H]⁺305.0784, found 305.0797.

Entry	Compound 2a	Reagent 11a	Product 12a	Comparative result
$\mathbf{1}$	N_2			95%, 40 min, (our study) Blue LED, 16 h, 80% 15 dirhodium tetraacetate, 10 h, 72% 16
$\overline{2}$	N_2		Bı	89%, 40 min, (our study) Cu, 16h, 81% 17 dirhodium tetraacetate, 10h, 69% $16\,$
3	N_2			75%, 40 min, (our study) tris(pentafluorophenyl)borate, 24h, 75% 18 Irradiation, 16 h, 56% 15
$\overline{4}$	N_2			90%, 40 min, (our study) tris(pentafluorophenyl)borate, 24h, 50% 18 dirhodium tetraacetate, 10 h, 50% 19
5	N_2 O ₂ N		O_2N	88%, 40 min, (our study) dirhodium tetraacetate, 64% $20\,$

Table S13. Comparative result for C-C bond formation, (cyclopropenation).

S8. Case study-6: Carbene insertion (N-C-O bond formation, oxazole) single objective multi-variant auto-optimization.

S.8.1 Background collection

Sample Preparation: We prepare 0.5 M stock solution of compound **2a** in DCE, 0.5 M stock solution of reagent **13a** in DCE and 0.5 M stock solution of product **14a** in DCE. The three of the solution taken in three different syringes.

To conduct our analysis, we utilized an In-line FTIR system. The experimental protocol involved the initial introduction of the solvent, DCE, for a duration of 10 min. using a syringe pump, during which data was recorded. Subsequently, a previously prepared stock solution of compound **2a** was similarly introduced into the In-line FTIR for 10 min. This process was repeated for the reaction product **14a** and reagent **13a**, each pumped for 10 min. Upon collecting all relevant data, we identified the signature peak present in the product. Using this peak as a reference, we employed a Bayesian optimizer to fine-tune and optimize the reaction conditions for improved results.

Figure S44. In-line IR background analysis of DCE, 0.5 M stock solution of **2a**, **13a**, and **14a** in DCE.

The distinctive shifting peak associated with product (**14a**) aligning within the range of 1730 to 1770 cm⁻¹. This specific peak, falling within this range, is designated as the signature peak for our analysis. During the optimization of the reaction through Bayesian methods, this signature peak serves as a pivotal reference point. We utilize it to calculate the area under the curve in the In-line FT-IR spectra, providing a quantitative measure of the area in the forthcoming reaction mixture.

S8.2. General procedure for the auto-optimized synthesis of compound 14a.

In our approach we are employing a Python-coded based Bayesian optimization strategy for further refinement. Initial steps involved the preparation of stock solutions for compound **2a** (0.1 M in DCE) and reagent **13a** (0.2 M in DCE), each filled into separate syringes and connected to a syringe pump. The solutions were then directed through a PFA tubular reactor (inner diameter $= 1$ mm, length $= 1.3$ m, volume $= 1$ mL) surrounded by a cylindrical-shaped blue LED light source. Once the solution setup was complete, input ranges for variable flow rates, voltages, and current were specified in the Python code designed for the reaction. The Bayesian optimizer systematically explored these varying reaction conditions, aiming to achieve maximum yield. The optimization process involved running 40-45 experiments and the results were tabulated in the optimization table (Table S14).

S8.2.1. Python code for optimized condition for N-C-O bond formation, (oxazole)

```
\boxed{)} ab6.py
    1 from os import listdir
    2 from os.path import isfile, join
    3 import serial
    5 import numpy as np
    6 import pandas as pd
    7 import time
    8 from scipy.integrate import trapz
    \alpha10 #step1: be sure to the address of the files that the ftir data is exported is matching to line 11 (mypath)
   11 mypath = "C:\\Users\\Admin\\Desktop\\ruchi\\Exp 2024-03-02 14-49"
   12 onlyfiles = [f for f in listdir(mypath) if isfile(join(mypath, f))]
   1314
   15 #step2: make sure that pump and the potentiostat is correctly addressed in the Line 16 and 17
   16 pump 1 = serial.Serial("COM4",9600) #Harvard Pump
   17 port = serial.Serial("COM1", 115200)
   18 printer = serial.Serial("COM9", 115200, timeout=1)
   19
   20
   21
   22 #step 3: grab the lines from 22 to 90 and presss f9
   23 def area under(data, start, end):
   24
         x = np.flip(data.iloc[start:end,0].to numpy())
   25
         y = np-flip(data.iloc[start:end,1].to(numpy())26
         area = trapz(y, x)27
         return np.abs(area)
   28
   29 def file namer(num):
          str1 = str(num)30
   31length = int(len((str1)))32empty = "33
          for i in range(5-length):
   34
              empty = empty + '0'35
   36
          return empt+str1
   37
   38
   39 def ftir extract(filename, init, end):
   4041
         filename = filename
   42
   43
         temp_df = pd.read_csv(filename)
   44
         # nump df = temp df. to numpy()
   45
          area = area under(temp df, init, end)# max\_peak = np.max(nump_df[90:120,1])46
   47
          print(area)
```

```
48
49
      return area
50
51
52 def function(flowrate_1,v,i):
53
       #set the pumps with the flowrate as the desired flowrate for the function
54
55
56
      fr 1 = flowrate 1 #ml/min
57
      pump 1.write(('irate '+str(fr_1)+' ml/min\r\n').encode())
58
59
      time.sleep(0.1)60
61
      #set the com port for potentiostat and set the voltage and current
62
      vol = v63
      curr = i#to change the voltge we need to use "VOLT 1" command
64
      port.write(('VOLT '+str(vol)+'\r\n').encode())
65
                                                       #to change the current we need to use "CURR 1" command
      port.write(('CURR '+str(curr)+'\r\n').encode())
66
67
68
      #pumps run
69
      pump 1.write((b'irun\r\n'))
70
      time.sleep(0.1)
71
      time.sleep(1000)
72
73 def function2(flowrate_1,v,i):
      time.sleep(1400)
74
75
76
      files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
77
78
      val = 079
80
      #change wavelengths as per product here.
81
      f row=15 #first row of range for wavelength as per IR CSV
82
      1_row=25 #Last row of range for wavelength as per IR CSV
83
      val += ftir_extract(files[-1],f_row,l_row)
84
85
      val+=ftir_extract(files[-2],f_row,l_row)
86
      val+=ftir extract(files[-3],f row,l row)
87
88
      avg val = val/389
90
      return avg val
91
92
93 #step 4:grab the Line 93 and f9
94 from skopt.optimizer import Optimizer
```

```
Carl Carl Corp.
                        Contractor
                                \sim95
 96
 97 #step5:in line 96 we have to define the range that (flowrate,voltage,current) (from,to) and after (anytime) appllying changes you need to grab the line 96 and f9
 98 #flowrates are in ml/min, voltage in V, Current in Ampere
 99 bounds = [(0.05, 0.150), (10.0, 14.5), (4.9, 5.0)]100
101
102 #step 6: arab the line 100 and f9103 opter =Optimizer(bounds,base_estimator='gp',n_initial_points=3,acq_func="EI",random_state=np.random.randint(3326))
104
105
106 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated
107 number of cycles = 22
108 results = []109 flowrates 1 = []110 \text{ vs } = []111 currents = []112
113 product wavelength=True #set to true if product wavelengths being monitored
114
115 if product_wavelength == True:
116
      val=1117 else:
118
       val=-1119
120
121 # Step 8: Test Tubes on Printer
122 USE PRINTER = True
123 REST HEIGHT = 200
124 X HOME = -5125 Y HOME = 20
126 Z HOME = 175127 DEFAULT PUMP TIME="1"
128 # Distance between test tubes
129 X SPACING=20
130 Y SPACING=20
131 # Number of test tubes
132 X ROWS = 11133 Y COLUMNS = 4134
135 def send cmd(cmd):
136
       print(cmd)
137
       printer.write(f"{cmd}\n".encode("ASCII"))
138
139 def move(x=None, y=None, z=None):
```

```
s = "60"140
141
       if x is not None:
142
           s \leftarrow f''X\{x\}''143
       if y is not None:
144
           s \leftarrow f''Y\{v\}''145
       if z is not None:
146
           s \leftarrow f''Z{z}''147
148
       s+= "F5000"
149
       send cmd(s)
150
151 def printer positions():
152
       for j in range(Y COLUMNS):
153
           for i in range(X ROWS):
154
                if \frac{1}{2} = -1:
155
                    yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
156
                else:
157
                   yield (X HOME + i * X SPACING, Y HOME + j * Y SPACING, Z HOME)
158
159 # Run this.
160 tube location = list(printer positions())
161
162
163 for i in range(number_of_cycles):
164
       move(*tube_location[2*i])
165
       asked = opter ask()166
       function(asked[0],asked[1],asked[2])
167
       move(*tube location[2*i+1])168
       \text{told} = function2(asked[0],asked[1],asked[2])
169
170
       print(f"area under the curve in the round \{i: .2f\} = \{told: .2f\}")
171
       opter.tell(asked,-told*val)
       results.append(told)
172
173
       flowrates 1.append(asked[0])
       vs.append[asked[1])174
175
       currents.append(asked[2])
176
177
       dict1 = {"flowrate_1":flowrates_1,"voltages":vs, "currents":currents,"area-results":results}
178
       df2 = pd.DataFrame(dict1)179
       df2.to_csv("output round "+str(i)+".csv")
180
181
182
183 pump_1.write(b'stop\r\n')
184
185
186
```
Table S14. Auto-optimization table of carbene insertion reaction (N-C-O bond formation, oxazole).

Reaction condition: compound **2a** (0.1 M in DCE); reagent **13a** (0.2 M in DCE); 1 mL reactor volume.

Graph:

We have plotted 3D graph of optimization table S14, we have taken flow rate on X-axis, blue light intensity (watt) on Y-axis and product yield on Z axis.

Figure S45. AI based system to auto-optimize and navigate this complexity and identify the optimal conditions for the photo activated [3+2] cycloaddition reaction. Compound **2a** (0.1 M in DCE); reagent **13a** (0.2 M in DCE); 1 mL reactor volume.

Figure S46. 2D graph between no of experiments performed versus yield (%) for the AI based auto-optimization of photo activated [3+2] cycloaddition reaction. Compound **2a** (0.1 M in DCE); reagent **13a** (0.2 M in DCE); 1 mL reactor volume.

Figure S47. AI based system navigated multi-numerical variable complexity and identify the optimal condtitons for the photo activated [3+2] cycloaddition reaction. Compound **2a** (0.1 M in DCE); reagent **13a** (0.2 M in DCE); 1 mL reactor volume.

S.8.3. General procedure for AI optimized carbene insertion into the triple bonds of C≡N for synthesis of compound 14a.

Figure S48. Schematic presentation of continuous flow for the synthesis, of compound **14a.** To prepare the stock solution of compound **2a** (2.20 g, 0.01 mol) was dissolved in DCE (100 mL) and connected with pump. Another pump was connected with the reagent **13a** (1.09 mL, 0.026 mol) dissolved in DCE (100 mL). These two pump out-put is further connected with the T_1 -mixer and pumps were running with the flow rate 31 μ L/min. each to maintain the stoichiometry and then passed through PFA tubular reactor (inner diameter $= 1$ mm, length $=$ 1.3 m, volume = 1 mL) under blue light (73.464 W) exposure. The room temperature of the reactor was controlled by fan attached to the bottom of the photochemical reactor. The out-put of the tubular reactor was connected with spring based back pressure regulator (~3 bar) to maintain the evaporation. First one hour of the product mixture was discarded and next 5 h of the product mixture [18.6 mL; **2a** (0.195 g)] was collected in HPLC bottle. The organic EtOAc phase was concentrated under reduced pressure to give the product **13a** (0.190g in 5 h, 91%)

as a colourless oil. **¹H NMR (500 MHz, CDCl3)** δ 7.70 – 7.67 (m, 2H), 7.32 – 7.30 (m, 2H), 4.00 (s, 3H), 2.38 (s, 3H). **¹³C NMR (126 MHz, CDCl3)** δ 154.28, 151.75, 131.56, 130.07, 129.22, 128.56, 126.01, 113.27, 59.84, 14.11. **IR (max):** 3019.92, 1741.94, 1646.73, 1214.78, 1013.60,745.47 cm-1 . **HRMS (ESI):** *m/z* calcd for **C11H11ClNO²** [M+H]⁺224.0473, found 224.0451. Verified the analytical data with those reported in the literature.²¹

Space time yield in previous reported batch process ²¹

Productivity $= 39.8$ mg in 24 h

Productivity (per h):
$$
=\frac{0.39}{24} = 0.0016
$$
 g/h

Space time yield :=
$$
\frac{\text{productivity}}{\text{volume of reactor}}
$$

$$
= \frac{0.0016}{1} = 0.0016 \text{ g} \ m L^{-1} h^{-1}
$$

Table S15. Comparative result for the carbene insertion (N-C-O bond formation, oxazole).

S9. Case study-7: Carbene insertion (C=C bond formation, fumarate) single objective multi-variant auto-optimization.

S9.1 Background collection

Sample Preparation: We prepare 0.5 M stock solution of compound **2a** in DCE, 0.5 M stock solution of reagent **15** in DCE and 0.5 M stock solution of product **16a** in DCE. The three of the solution taken in three different syringes.

To conduct our analysis, we utilized an In-line FTIR system. The experimental protocol involved the initial introduction of the solvent, DCE, for a duration of 10 min. using a syringe pump, during which data was recorded. Subsequently, a previously prepared stock solution of compound **2a** was similarly introduced into the In-line FTIR for 10 min. This process was repeated for the reaction product **16a** and reagent **15**, each pumped for 10 min. Upon collecting all relevant data, we identified the signature peak present in the product. Using this peak as a reference, we employed a Bayesian optimizer to fine-tune and optimize the reaction conditions for improved results.

Figure. S49. In-line IR background analysis of DCE, 0.5 M stock solution of **1a**, **15a**, and **16a** in DCE.

The distinctive shifting peak associated with product (**16a**) aligning within the range of 1715 to 1760 cm⁻¹. This specific peak, falling within this range, is designated as the signature peak for our analysis. During the optimization of the reaction through Bayesian methods, this signature peak serves as a pivotal reference point. We utilize it to calculate the area under the curve in the In-line FT-IR spectra, providing a quantitative measure of the area in the forthcoming reaction mixture.

S8.2. General procedure for the auto-optimized synthesis of compound 16a.

Initial steps involved the preparation of stock solutions for compound **2a** (0.1 M in DCE) and reagent **15** (0.1 M in DCE), each filled into separate syringes and connected to a syringe pump.

The solutions were then directed through a PFA tubular reactor (inner diameter $= 1$ mm, length $= 1.3$ m, volume $= 1$ mL) surrounded by a cylindrical-shaped blue LED light source. Once the solution setup was complete, input ranges for variable flow rates, voltages, and current were specified in the Python code designed for the reaction. The Bayesian optimizer systematically explored these varying reaction conditions, aiming to achieve maximum yield. The optimization process involved running 40-45 experiments and the results were tabulated in the optimization table (Table S16).
S8.2.1. Python code for optimized condition for C=C bond formation, fumarate

```
1 from os import listdir
 2 from os.path import isfile, join
 3 import serial
 5 import numpy as np
 6 import pandas as pd
 7 import time
 8 from scipy.integrate import trapz
10 #step1: be sure to the address of the files that the ftir data is exported is matchina to line 11 (mypath)
11 mypath = "C:\\Users\\Admin\\Desktop\\ruchi\\Exp 2024-03-06 13-11"
12 onlyfiles = [f for f in listdir(mypath) if isfile(join(mypath, f))]
1314 #step2: make sure that pump and the potentiostat is correctly addressed in the line 16 and 17
15 pump 1 = serial.Serial("COM17",9600) #Syringe Pump
16 port = serial.Serial("COM1",115200)
17 printer = serial.Serial("COM9", 115200, timeout=1)
18
19 r 1=13.36 #radius of syringe used (50ml, 14.25/20ml, 9.6/10ml, 7.25/5ml, 6.03/3ml, 4/3/1ml, 2.39/60ml, 13.36)
20 pump 1 k=(13.36/r 1)**2
21
22 #step 3: arab the Lines from 22 to 90 and presss f9
23 def area under(data.start.end):
x = np-flip(data.iloc[start:end, 0].to numpy())25
      y = np-flip(data.iloc[start:end, 1].to numpy())26
      area = trapz(v,x)27
      return np.abs(area)
28
29 def file namer(num):
30
      str1 = str(num)31length = int(len((str1)))empt = ''3233
      for i in range(5-length):
34
          empt = empt + '0'35
36
      return empt+str1
37
38
39 def ftir extract(filename,init,end):
40
41
      filename = filename42
43
   temp df = pd.read csv(filename)
44# nump df = temp \overline{df}. to numpy()
45
      area = area_under(temp_df, init, end)
46
      # max peak = np.max(nump df[90:120,1])47
      print(area)
```

```
48
49
      return area
50
51
52 def function(flowrate_1,v,i):
53
54
       #set the pumps with the flowrate as the desired flowrate for the function
55
56
      fr 1 = flowrate 1*1000*pump 1 k #ml/min to microliter/min and syringe correction factor
57
      send syr command(f'fr{fr 1}')
58
      time.sleep(0.1)59
60
      #set the com port for potentiostat and set the voltage and current
61
      vol = v62
      curr = i63
      port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                       #to change the voltge we need to use "VOLT 1" command
64
      port.write(('CURR '+str(curr)+'\r\n').encode())
                                                       #to change the current we need to use "CURR 1" command
65
66
67
      #pumps run
68
      time.sleep(0.1)69
      time.sleep(20)
70
71 def function2():
72
      time.sleep(20)
73
74
      files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
75
76
      val = 077
78
      #change wavelengths as per product here.
79
      f row=11 #first row of range for wavelength as per IR CSV
80
      1 row=15 #last row of range for wavelength as per IR CSV
81
82
      val += ftir extract(files[-1],f row,l row)
83
      val+=ftir extract(files[-2],f row,l row)
84
      val+=ftir_extract(files[-3],f_row,l_row)
85
86
      avg val = val/387
88
      return avg_val
89
90
91 #step 4:grab the line 93 and f9
92 from skopt.optimizer import Optimizer
93
94
```

```
95 def send syr command(command):
 96
        pump 1.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
 97
        pump 1. flush() # Flush the serial buffer
 98
 99
100 #step5:in line 96 we have to define the range that (flowrate, voltage, current) (from, to) and after (anytime) appllying changes you need to grab the line 96 and f9
101 #flowrates are in ml/min, voltage in V, Current in Ampere
102 bounds = [(0.05, 0.15), (10.0, 14.5), (0.0, 5.0)]103
104 #step 6: arab the line 100 and f9105 opter =0ptimizer(bounds,base estimator='gp',n initial points=3,acq func="EI",random state=np.random.randint(3326))
106
107
108 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated
109 number of cycles = 22110 results = []
111 flowrates 1 = []112 \text{ vs } = []113 currents = []
114
115 product wavelength=True #set to true if product wavelengths being monitored
116
117 if product wavelength == True:
118 val=1119 else:
120 \text{ val} = -1121
122
123 # Step 8: Test Tubes on Printer
124 USE PRINTER = True
125 REST HEIGHT = 200
126 \times HOME = -5
127 Y HOME = 20128 \overline{Z} HOME = 175
129 DEFAULT PUMP TIME="1"
130 # Distance between test tubes
131 X SPACING=20
132 Y SPACING=20
133 # Number of test tubes
134 X ROWS = 11
135 Y COLUMNS = 4136
137 def send cmd(cmd):
138 print(cmd)139
        printer.write(f"{cmd}\n".encode("ASCII"))
140
```

```
141 def move(x=None, y=None, z=None):
142
     = \frac{1}{10} G0"
143
      if x is not None:
144
           s \leftarrow f''X\{x\}''145
      if y is not None:
146
           s \leftarrow f''Y(y)''147
       if z is not None:
148
           s \leftarrow f''Z{z}''149
150
       s+= "F5000"
151
       send cmd(s)152
153 def printer positions():
154
      for j in range(Y_COLUMNS):
155
           for i in range(X ROWS):
156
               if j%2 == 1:
157
                   yield (X HOME + (X ROWS - 1 - i) * X SPACING, Y HOME + j * Y SPACING, Z HOME)
158
               else:
159
                   yield (X HOME + i * X SPACING, Y HOME + j * Y SPACING, Z HOME)
160
161 # Run this.
162 tube_location = list(printer_positions())
163
164 time.sleep(2)165
166 for i in range(number_of_cycles):
       move(*tube location[2*i])
167
168
       asked = opter ask()169
       print (asked[0])
       function(asked[0],asked[1],asked[2])
170
171
       move(*tube location[2*i+1])172
       \text{told} = function2()
173
174
       print(f"area under the curve in the round \{i: .2f\} = \{told: .2f\}')
175
       opter.tell(asked,-told*val)
176
       results.append(told)
177
       flowrates 1.append(asked[0])
178
       vs.append(asked[1])179
       currents.append(asked[2])
180
181
       dict1 = {"flowrate 1":flowrates 1,"voltages":vs, "currents":currents,"area-results":results}
182
       df2 = pd.DataFrame(idict1)183
       df2.to csv("output round "+str(i)+".csv")
184
185
186
187 send_syr_command("stop")
                                #turns off syringe pump flow
```


Table S16. Auto-optimization table of cross coupling reaction (C=C bond formation, fumarate).

Reaction condition: compound **2a** (0.1 M in DCE); reagent **15** (0.1 M in DCE); 1 mL reactor volume.

Graphs:

We have plotted 3D graph of optimization table S16, we have taken flow rate on X-axis, blue light intensity (watt) on Y-axis and product yield on Z axis.

Figure S50. AI based system to auto-optimize and navigate this complexity and identify the optimal conditions for the photo activated cross-coupling reaction. Compound **2a** (0.1 M in DCE); reagent **15** (0.1 M in DCE); 1 mL reactor volume.

Figure S51. 2D graph between No of experiments performed versus Yield (%) for the AI based auto-optimization for the photo activated cross-coupling reaction. Compound **2a** (0.1 M in DCE); reagent **15** (0.1 M in DCE); 1 mL reactor volume.

Figure S52. AI based system navigated multi-numerical variable complexity and identify the optimal condition for the photo activated crosscoupling reaction. Compound **2a** (0.1 M in DCE); reagent **15** (0.1 M in DCE); 1 mL reactor volume.

S.8.3. General procedure for AI optimized cross coupling reaction of ethyl diazoetherate and aryldiazoester for synthesis of compound 16a.

Figure S53. Schematic presentation of continuous flow for the synthesis, of compound **16.** To prepare the stock solution of compound **2a** (2.20 g, 0.01 mol) was dissolved in DCE (100 mL) and connected with pump. Another pump was connected with the reagent **15** (1.32 mL, 0.01 mol) dissolved in DCE (100 mL). These two pump out-put is further connected with the T_1 -mixer and pumps were running with the flow rate 40 μ L/min.each to maintain the stoichiometry and then passed through PFA tubular reactor (inner diameter $= 1$ mm, length $=$ 1.3 m, volume = 1 mL) under blue light (67.034 W) exposure. The room temperature of the reactor was controlled by fan attached to the bottom of the photochemical reactor. The out-put of the tubular reactor was connected with spring based back pressure regulator (~3 bar) to maintain the evaporation. First one hour of the product mixture was discarded and next 5 h of the product mixture [24.3 mL; **2a** (0.255 g)] was collected in HPLC bottle. The organic EtOAc phase was concentrated under reduced pressure to give the product **16a** (0.29 g in 5 h, 89%) as

a colourless oil. **¹H NMR (400 MHz, CDCl3)** δ 7.35– 7.32 (m, 2H), 7.21 – 7.16 (m, 2H), 7.03 (s, 1H), 4.06 (q, *J* = 7.1 Hz, 2H), 3.79 (s, 3H), 1.10 (t, *J* = 7.1 Hz, 3H). **¹³C NMR (126 MHz, CDCl3)** δ 166.34, 164.93, 142.65, 134.63, 132.35, 130.36, 129.81, 128.06, 61.02, 52.97, 13.84. **IR (max):** 2985.96, 1719.69, 1439.07, 1242.01, 832.82 cm-1 . **HRMS (ESI):** *m/z* calcd for **C**₁₃**H**₁₄**ClO**₄ [M+H]⁺ 269.0575, found 269.0590. Verified the analytical data with those reported in the literature.²⁴

Space time yield in previous reported batch process ²⁴

Productivity $= 41.5$ mg in 12 h

Productivity (per h):
$$
=\frac{0.041}{12} = 0.0034
$$
 g/h

Space time yield ∶= productivity volume of reactor

$$
= \frac{0.0034}{2} = 0.0017 \text{ g} mL^{-1} h^{-1}
$$

Table S17. Comparative result for the carbene insertion (C=C bond formation, fumarate).

S10. Case study-8: On demand chemical synthesis.

After individually optimizing the experimental conditions and validating our codes for carbene insertion reactions with varied nucleophiles photo chemically, we aimed to integrate all the python codes (AB1, AB2, AB3, AB4, AB5, AB6, AB7) with optimized conditions. We drew inspiration from the natural grafting technique observed in hibiscus plants, where the root remains the same, but a portion of one plant is placed into the branch of another, resulting in the growth of the same kind of flower with different colours. Similarly, in our "digichemtree" approach, we maintain the same starting material, 4-chloro phenyl diazoester (**2a**), but graft our tree with varied nucleophiles (**3a**, **5a**, **7a**, **9a**, **11a**, **13**, **15**) to obtain our respective carbeneinserted products photo chemically. The neural network remains unchanged from our individual experiments, but we've now integrated a total of 9 pumps to flow the starting material and nucleophiles. The outlets of these pumps are connected to an 8-port valve for mixing purposes. The resulting stock solution then passes through a 1 mL PFA tubular reactor with a blue LED and tunable power supply. For fraction collection, we've utilized our tailormade 3D printer module. This integrated system employs 4 syringe pumps and 5 HPLC pumps. As a model reaction, we've conducted 7 chemical transformations with 7 different nucleophiles.

Figure S54. Actual picture of the setup.

S10.1. Python code for integrated optimized condition for carbene insertion reactions.

AB1.PY CODE (for benzoic acid)


```
47x = np-flip(data.iloc[start:end, 0].to numpy())48
        y = np-flip(data.iloc[start:end,1].to numpy())49
        area = trapz(y,x)50
        return np.abs(area)
  51
 52 def file_namer(num):
  53
        str1 = str(num)54
        length = int(len((str1)))55
        empt = ''56
        for i in range(5-length):
  57
            empty = empty + '0'58
  59
        return empt+str1
  60
  61
 62 def ftir extract(filename, init, end):
  63
  64
        filename = filename65
  66
        temp df = pd.read.csv(filename)67
        # nump df = temp df, to numpy()
  68
        area = area under(temp df, init, end)69
        # max peak = np.max(nump df[90:120,1])70
        print(area)71
  72return area
  7374
 75 def function(flowrate 1,flowrate 2,flowrate 3,flowrate 4,flowrate 5,flowrate 6,flowrate 7,flowrate 8,flowrate 9,v,i):
  76
  77
         #set the pumps with the flowrate as the desired flowrate for the function
  78
  79
        fr 1 = flowrate 1*1000*pump 1 k #ml/min to microliter/min and syringe correction factor
  80
        #fr 2 = flowrate 2*1000*pump 2 k #ml/min to microliter/min and syringe correction factor
  81
        #fr 3 = flowrate 3*1000*pump 3 k #ml/min to microliter/min and syringe correction factor
  82
        #fr 4 = flowrate 4*1000*pump 4 k #ml/min to microliter/min and syringe correction factor
  83
        #fr 5 = flowrate 5*1000 #ml/min
  84
        #pump 5.write(('flow:'+ str(fr 5) + '\r').encode())
 85
  86
        \#time.sleep(0.1)87
        #fr 6=flowrate 6*1000 #converting ml/min to ul/min as pump takes this as input val
  88
        #pump 6.write((\overline{('flow:'+ str(fr 6) + '}\r').encode())
 89
 90<sub>o</sub>\#time.sleep(0.1)91 #fr_7 = flowrate_7*1000 #ml/min
```

```
92
     #pump 7.write(('flow:'+ str(fr_7) + '\r').encode())
```

```
93
 94
       \#time.sleep(0.1)95
       #fr 8=flowrate 8*1000 #converting ml/min to ul/min as pump takes this as input val
 96
       #pump 8.write(('flow:'+ str(fr 8) + '\r').encode())
 97
 98
       time.sleep(0.1)99
       fr 9=flowrate 9*1000 #converting ml/min to ul/min as pump takes this as input val
100
       pump 9.\text{write}(\overline{('flow:'+ str(fr 9) + '\r').encode'}))101
       time.sleep(0.1)102#set the com port for potentiostat and set the voltage and current
103
104
       vol = v105
       curve = iport.write(('VOLT '+str(vol)+'\r\n').encode())
                                                          #to change the voltge we need to use "VOLT 1" command
106
107
       port.write(('CURR '+str(curr)+'\r\n').encode())
                                                          #to change the current we need to use "CURR 1" command
108
109
110
       #pumps run
111
       #pump 5.write(b'on\r')
112
      #time.sleep(0.1)
113
     #pump 6.write(b'on\r')
114
     \#time. sleep(0.1)
115
      #pump 7.write(b'on\r')
116
      \#time.sleep(0.1)#pump 8. write(b'on \r')
117
118
       \#time.sleep(0.1)119
       pump 9.write(b'on\r')
120
       time.sleep(0.1)121
122123
       send syr command 1(f'fr{fr 1}')
124
       #send syr command 2(f'frffr 2)')125
       #send_syr_command_3(f'fr{fr_3}')
       #send syr command 4(f'frffr + 4)'126
127
       time.sleep(6000)
128 def function2():
       time.sleep(6000) # Last 3 minutes
129
130
       files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
131
132
       val = 0133
134
       #change wavelengths as per product here.
135
       f row=17 #first row of range for wavelength as per IR CSV
136
       1 row=24 #Last row of range for wavelength as per IR CSV
137
```
val += ftir_extract(files[-1],f_row,1_row) 138 val += ftir_extract(files[-2],f_row,1_row) 139 140 val += ftir extract(files[-3], f $row, 1row$) 141 142 $avg val = val/3$ 143 144 return avg_val 145 146 147 #step 4:grab the Line 93 and f9 148 from skopt.optimizer import Optimizer 149 150 def send_syr_command_1(command): 151 pump 1.write(command.encode() + $b'\n$ + Send the command to Arduino with a newline character $pump 1. flush()$ # Flush the serial buffer 152 153 154 #def send syr command 2(command): #pump 2.write(command.encode() + b'\n') # Send the command to Arduino with a newline character 155 156 #pump 2.flush() # Flush the serial buffer 157 158 #def send_syr_command_3(command): 159 #pump 3.write(command.encode() + b'\n') # Send the command to Arduino with a newline character 160 #pump 3.flush() # Flush the serial buffer 161 #def send syr command 4(command): 162 #pump 4.write(command.encode() + $b'\nmid n'$) # Send the command to Arduino with a newline character 163 #pump 4.flush() # Flush the serial buffer 164 #step5:in line 96 we have to define the range that (flowrate, voltage, current) (from, to) and after (anytime) appllying changes you need to grab the line 96 and f9 165 #flowrates are in ml/min, voltage in V, Current in Ampere 166 bounds = $[(-0.050, -0.049), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2),$ 167 #step 6: grab the Line 100 and f9 168 opter =0ptimizer(bounds,base estimator='gp',n initial points=3,acq func="EI",random state=np.random.randint(3326)) 169 170 171 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated 172 number of cycles = 5 173 results = \lceil] 174 flowrates $1 = []$ 175 #flowrates_2 = $[]$ 176 #flowrates $3 = 1$ 177 #flowrates $4 = 1$ 178 #flowrates $5 = 1$ 179 #flowrates $6 = \lceil$ 180 #flowrates $7 = 1$ 181 #flowrates $8 = \lceil \rceil$ 182 flowrates $9 = []$ 183 vs = $[$]

```
184 currents = [1]185
186 product wavelength=True #set to true if product wavelengths being monitored
187
188 if product_wavelength == True:
189 val=1190 else:
191 val=-1192
193 # Step 8: Test Tubes on Printer
194 USE_PRINTER = True
195 REST HEIGHT = 200
196 X HOME = -5
197 Y HOME = 20198 Z HOME = 175
199 DEFAULT PUMP TIME="1"
200 # Distance between test tubes
201 X SPACING=20
202 Y SPACING=20
203 # Number of test tubes
204 X ROWS = 11
205 Y COLUMNS = 4
206
207 def send cmd(cmd):
208 print(cmd)
      printer.write(f"{cmd}\n".encode("ASCII"))
209
210
211 #--------------------code for changing column for run---
212 column num=1 #column number of run to try from
213 Y HOME=Y HOME+(column num-1)*Y SPACING
215
216
217 def move(x=None, y=None, z=None):
218 s = "60"
      if x is not None:
219
220
       s \leftarrow f''X\{x\}''221
    if y is not None:
222
        s + = f''Y{y}''223
      if z is not None:
224
        s \leftarrow f''Z{z}''225
226
      s+= "F5000"
227
      send_cmd(s)
228
```
229 def printer positions(): 230 for j in range(Y_COLUMNS): 231 for i in range(X ROWS): 232 if j %2==1: 233 yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME) 234 else: 235 yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME) 236 237 # Run this. 238 tube_location = list(printer_positions()) 239 240 time.sleep(2) 241 242 try: 243 for i in range(number_of_cycles): 244 $move$ (*tube_location $[2^*i])$ 245 $asked = opter ask()$ 246 function(asked[0],asked[1],asked[2],asked[3],asked[4],asked[5],asked[6],asked[7],asked[8],asked[9],asked[10]) 247 $move$ (*tube_location $[2*i+1])$ 248 told= function2() 249 250 print(f"area under the curve in the round $\{i: .2f\} = \{told: .2f\}'$) 251 opter.tell(asked,-told*val) 252 results.append(told) 253 flowrates_1.append(asked[0]) 254 #flowrates 2.append(asked[255 #flowrates 3.append(asked[2] 256 #flowrates_4.append(asked[3]) 257 #flowrates 5.append(asked[4]) 258 #flowrates_6.append(asked[5]) 259 #flowrates_7.append(asked[6]) 260 #flowrates 8.append(asked[7] flowrates_9.append(asked[8]) 261 262 $vs.append[asked[9])$ 263 currents.append(asked[10]) 264 #dict1 = {"flowrate_2":flowrates_2,"flowrate_3":flowrates_3,"flowrate_4":flowrate_5";flowrate_5":flowrates_5,"flowrates_6,"flowrates_7,"flowrate_8":flowrates_8,"flowrates_8,"flowrates_8,"flowrates_9":flowrates_9,"volta 265 dict1 = {"flowrate_1":flowrates_1,"flowrates_9":flowrates_9,"voltages":vs,"currents":currents,"area-results":results} 266 $df2 = pd.DataFrame(idict1)$ 267 df2.to_csv("output round "+str(i)+".csv") 268 finally: 269 pump_1.write(b'stop\r') 270 #pump_2.write(b'stop\r' 271 #pump 3.write(b'stop\r' 272 #pump_4.write(b'stop\r' 273 #pump 5.write(b'off\r') #pump_6.write(b'off\r') 274 275 #pump_7.write(b'off\r') #pump 8.write(b'off\r') 276 277 pump_9.write(b'off\r') 278

AB2.py (for thiophenol)

```
AB2.py
    \overline{1}2 nmm
    3 Created on Wed Aug 30 14:48:13 2023
    \overline{A}5 @author: Admin
   6 \frac{m}{m}\overline{7}\mathbb{R}9 from os import listdir
   10 from os.path import isfile, join
   11 import serial
   12
   13 import numpy as np
   14 import pandas as pd
   15 import time
   16 from scipy.integrate import trapz
   17
   18 #step1: be sure to the address of the files that the ftir data is exported is matching to line 11 (mypath)
   19 mypath = "C:\\Users\\Admin\\Desktop\\ruchi\\Exp 2024-04-11 11-04"
   20 onlyfiles = [f for f in listdir(mypath) if isfile(join(mypath, f))]
   21
   22
   23 #step2: make sure that pump and the potentiostat is correctly addressed in the Line 16 and 17
   24 #pump 1 = serial.Serial("COM10",9600) #hwSyringe Pump
   25 pump 2 = serial.Serial("COM16",9600) #Syringe Pump
   26 #pump 3 = serial. Serial ("COM19", 9600) #Syringe Pump
   27 #pump 4 = serial.Serial("COM15", 9600) #Syringe Pump
   28 #pump 5 = serial.serial for url("COM29", 9600) #HPLC Pump LAN
   29 #pump 6 = serial.serial for url("socket://169.254.225.18:10001",9600)
   30 port = serial.Serial("COM1",115200)
   31 #pump 7 = serial.Serial("COM28", 9600) #HPLC Pump
   32 #pump 8 = serial.Serial('COM30", 9600) #HPLC Pump
   33 pump 9 = serial.Serial("COM5",9600) #HPLC Pump
   34 printer = serial.Serial("COM14", 115200, timeout=1)
   35
   36 r_1=14.25 #radius of syringe used (50ml, 14.25/20ml, 9.6/10ml, 7.25/5ml, 6.03/3ml, 4/3/1ml, 2.39/60ml, 13.36)
   37 r 2=14.25
   38 r 3=14.25
   39 r 4=14.25
   40 #pump 1 k=(14.25/r 1)**2
   41 pump 2 k=(14.25/r 2)*242 #pump 3 k=(14.25/r 3)*243 #pump_4_k=(14.25/r_4)**2
   44
   45 #step 3: grab the lines from 22 to 90 and presss f9
  46 def area under(data, start, end):
```

```
47
      x = np-flip(data.iloc[start:end, 0].to numpy())48
      y = np-flip(data.iloc[start:end, 1].to(numpy())49
      area = trapz(y, x)50
      return np.abs(area)
51
52 def file namer(num):
53
       str1 = str(num)54
       length = int(len((str1)))55
       \text{empty} = \cdotsfor i in range(5-length):
56
57
           empty = empty + '0'58
59
       return empt+str1
60
61
62 def ftir extract(filename, init, end):
63
64
       filename = filename65
66
      temp_df = pd.read_csv(filename)
67
      # nump df = temp df, to numpy()
       area = area under(temp df, init, end)68
69
      # max peak = np.max(nump df[90:120,1])
70
       print(area)71
72
       return area
73
74
75 def function(flowrate_1,flowrate_2,flowrate_3,flowrate_4,flowrate_5,flowrate_6,flowrate_7,flowrate_8,flowrate_9,v,i):
76
77
       #set the pumps with the flowrate as the desired flowrate for the function
78
79
      #fr 1 = flowrate 1*1000*pump 1 k #ml/min to microliter/min and syringe correction factor
80
      fr<sub>2</sub> = flowrate_2*1000*pump_2_k #ml/min to microliter/min and syringe correction factor
81
      #fr 3 = flowrate 3*1000*pump 3 k #ml/min to microliter/min and syringe correction factor
      #fr 4 = flowrate 4*1000*pump 4 k #ml/min to microliter/min and syringe correction factor
82
83
      #fr 5 = \frac{1}{2} = flowrate 5*1000 #ml/min
84
      #pump_5.write((\overline{f}Low:'+ str(\overline{f}r 5) + '\r').encode())
85
86
      #time.sleep(0.1)
87
      #fr 6=flowrate 6*1000 #converting ml/min to ul/min as pump takes this as input val
88
      \#pump_6.write(\overline{('flow:'+ str(fr_6) + '}\r')\cdot encode())89
90#time.sleep(0.1)91#fr 7 = flowrate 7*1000 #ml/min
92
       #pump 7.write(('flow:'+ str(fr 7) + '\r').encode())
```

```
-93
 94
       \#time.sleep(0.1)95
       #fr_8=flowrate_8*1000 #converting ml/min to ul/min as pump takes this as input val
96
       #pump 8.write(('flow:'+ str(fr 8) + '\r').encode())
97
98
      time.sleep(0.1)
99
       fr 9=flowrate 9*1000 #converting ml/min to ul/min as pump takes this as input val
100
       pump_9.write(\overline{('flow:'+ str(fr_9)} + '\r').encode())101
       time.sleep(0.1)102
103
       #set the com port for potentiostat and set the voltage and current
104
       vol = v105
       curr = i106
       port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                        #to change the voltge we need to use "VOLT 1" command
107
       port.write(('CURR '+str(curr)+'\r\n').encode()) #to change the current we need to use "CURR 1" command
108
109
110 #pumps run
111 \#pump_5.write(b'on\nr')112 \#time.sleep(\theta.1)113 #pump 6.write(b'on\r')
114 \# time.sleep(0.1)115 #pump_7.write(b'on\r')
116
      \#time.sleep(0.1)117
      \#pump_8.write(b'on\r')118
      #time.sleep(0.1)119
       pump 9.write(b'on\r')
120
       time.sleep(0.1)121
122
123
      #send_syr_command_1(f'fr{fr_1}')
124
       send syr command 2(f'fr{fr 2}')
       #send_syr_command_3(f'fr{fr_3}')
125
126
       #send\_syr\_command_4(f'fr{fr_4})')127
       time.sleep(3300)
128 def function2():
       time.sleep(3390) # Last 3 minutes
129
       files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
130
131
132
       val = 0133
134
       #change wavelengths as per product here.
135
       f_row=17 #first row of range for wavelength as per IR CSV
136
       1_row=24 #Last row of range for wavelength as per IR CSV
137
```

```
138
       val += ftir extract(files[-1],f row,l row)
139
       val += ftir_extract(files[-2],f_row,1_row)
140
       val += ftir_extract(files[-3], f_row, l_row)
141
       avg_val = val/3142
143
144
       return avg val
145
146
147 #step 4:grab the line 93 and f9
148 from skopt.optimizer import Optimizer
149
150 #def send_syr_command_1(command):
      #pump 1.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
151
152
      #pump 1.flush() # Flush the serial buffer
153
154 def send_syr_command_2(command):
       pump_2.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
155
156
       pump 2. flush() # Flush the serial buffer
157
158 #def send syr command 3(command):
159 #pump 3.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
160 #pump 3.flush() # Flush the serial buffer
161 #def send syr command 4(command):
162 #pump_4.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
163 #pump 4. flush() # Flush the serial buffer
164 #step5:in line 96 we have to define the range that (flowrate, voltage, current) (from, to) and after (anytime) appllying changes you need to grab the line 96 and f9
165 #flowrates are in ml/min, voltage in V, Current in Ampere<br>166 bounds = [(-10.0,-5.0) (0.086,0.087)] (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2)
167 #step 6: grab the Line 100 and f9
168 opter =Optimizer(bounds, base estimator='gp', n initial points=3, acq func="EI", random state=np.random.randint(3326))
169
170
171 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated
172 number_of_cycles =5
173 results = []174 #flowrates 1
175 flowrates 2 = []176 #flowrates_3 = []177 #flowrates 4 =178 #flowrates 5 = 1179 #flowrates 6 = []180 #flowrates_7 = []181 #flowrates 8 = 1182 flowrates 9 = []183 \text{ vs } = []
```

```
184 currents = []
185
186 product_wavelength=True #set to true if product wavelengths being monitored
187
188 if product wavelength == True:
189
    val=1190 else:
191
    val=-1192
193 # Step 8: Test Tubes on Printer
194 USE PRINTER = True
195 REST HEIGHT = 200
196 X HOME = -5
197 Y_HOME = 20198 Z HOME = 175
199 DEFAULT_PUMP_TIME="1"
200 # Distance between test tubes
201 X SPACING=20
202 Y SPACING=20
203 # Number of test tubes
204 X_ROWS = 11205 Y COLUMNS = 4
206
207#--------------------code for changing column for run---
208 column_num=2 #column number of run to try from
209 Y_HOME=Y_HOME+(column_num-1)*Y_SPACING
211
212 def send cmd(cmd):
213
      print(cmd)
214
      printer.write(f"{cmd}\n".encode("ASCII"))
215
216 def move(x=None, y=None, z=None):
217
     s = "G0"if x is not None:
218
219
      s += f''X{x}^n220
     if y is not None:
221
        s \leftarrow f''Y\{y\}''222
     if z is not None:
223
          s \leftarrow f''Z{z}''224
```

```
225
        s+= "F5000"
226
        send_cmd(s)
227
228 def printer_positions():
229
        for j in range(Y_COLUMNS):
230
            for i in range(X_ROWS):
231
                 if j%2==1:
232
                     yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
                 else:233
                     yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
234
235
236 # Run this.
237 tube_location = list(printer_positions())
238
239 time.sleep(2)
240
241 try:
242
        for i in range(number of cycles):
            move(*tube_location[2*i])
243
244
            asked = opter ask()245
            function(asked[0],asked[1],asked[2],asked[3],asked[4],asked[5],asked[6],asked[7],asked[8],asked[9],asked[10])
246
            move(*tube_location[2*i+1])247
            told= function2()
248
249
            print(f"area under the curve in the round {i:.2f} = {told:.2f}")250opter.tell(asked,-told*val)
251
            results.append(told)
252
            #flowrates 1.append(aske
253
            flowrates_2.append(asked[1])
254
            #flowrates 3.append(asked[2]
255
            #flowrates_4.append(asked[3])
256
            #flowrates 5.append(asked[4]
257
            #flowrates_6.append(asked[5])
258
            #flowrates_7.append(asked[6])
259
            #flowrates 8.append(asked[1
260
            flowrates_9.append(asked[8])
261
            vs.append(asked[9])
262
            currents.append(asked[10])
263
             #dict1 = {"flowrate_2":flowrates_2,"flowrate_3":flowrates_3,"flowrates_3,"flowrates_4,"flowrates_4,"flowrates_5;"flowrates_6;"flowrates_6,"flowrates_7;"flowrates_7;"flowrates_8;"flowrates_8,"flowrates_9":flowrates_9
264
            \text{dict1 = } \{\text{"flower} = 2^n; \text{flower} = 2, \text{``flower} = 3^n; \text{flower} = 9^n; \text{flower} = 9, \text{``voltages''}: \text{v3}, \text{``currents''}:\text{currents''}:\text{currents''}:\text{area}:\text{results''}:\text{results} \}265
266
            df2 = pd.DataFrame267
            df2.to_csv("output round "+str(i)+".csv")
```
268 finally:

- 269 #pump 1.write(b'stop\r') 270 pump 2.write(b'stop\r') 271 #pump 3.write(b'stop\r'
- 272 #pump 4.write(b'stop\r')
- 273 #pump_5.write(b'off\r')
- 274 #pump_6.write(b'off\r')
- 275 #pump 7.write(b'off\r')
- 276 #pump_8.write(b'off\r')
- 277 pump 9.write(b'off\r')
- 278

AB3.py (for aniline)


```
45 #step 3: grab the lines from 22 to 90 and presss f9
46 def area under(data, start, end):
     x = np-flip(data.iloc[start:end, 0].to numpy())47
48
     y = np-flip(data.iloc[start:end,1].to numpy())49
     area = trapz(y,x)50
     return np.abs(area)
51
52 def file namer(num):
53
      str1 = str(num)54
      length = int(len((str1)))\text{empty} = \text{``}55
56
      for i in range(5-length):
57
          empty = empty + '0'58
59
      return empt+str1
60
61
62 def ftir extract(filename, init, end):
63
64
      filename = filename
65
66
    temp df = pd.read csv(filename)
67
     # nump df = temp df. to numpy()
68
     area = area under(temp df, init, end)
69
      # max\_peak = np.max(nump_d[f[90:120,1])70
      print(area)
71
72
      return area
73
74
75 def function(flowrate 1,flowrate 2,flowrate 3,flowrate 4,flowrate 5,flowrate 6,flowrate 7,flowrate 8,flowrate 9,v,i):
76
77
       #set the pumps with the flowrate as the desired flowrate for the function
78
79
      #fr_1 = flowrate_1*1000*pump_1_k #ml/min to microliter/min and syringe correction factor
      #fr 2 = flowrate 2*1000*pump 2 k #ml/min to microliter/min and syringe correction factor
80
81
      fr 3 = flowrate 3*1000*pump 3 k #ml/min to microliter/min and syringe correction factor
82
      #fr 4 = flowrate 4*1000*pump 4 k #ml/min to microliter/min and syringe correction factor
83
     #fr_5 = flowrate_5*1000 #ml/min
84
      \#pump_5.write(('flow:'+ str(fr_5) + '\r').encode())85
```

```
86
      \#time.sleep(0.1)87
       #fr 6=flowrate 6*1000 #converting ml/min to ul/min as pump takes this as input val
       #pump 6.write(('flow:'+ str(fr 6) + '\r').encode())
88
89
      #time.sleep(0.1)90
91
      #fr 7 = flowrate 7*1000 #ml/min
92
      #pump_7.write(('flow:'+ str(fr_7) + 'r').encode())93
94
       #time.sleep(0.1)95
       #fr 8=flowrate 8*1000 #converting ml/min to ul/min as pump takes this as input val
96
      #pump 8.write(('flow:'+ str(fr 8) + '\r').encode())
97
98
      time.sleep(0.1)
99
       fr 9=flowrate 9*1000 #converting ml/min to ul/min as pump takes this as input val
100
       pump 9.write(('flow:'+ str(fr 9) + '\r').encode())
101
       time.sleep(0.1)102
103
       #set the com port for potentiostat and set the voltage and current
104
       vol = v105
       curr = iport.write(('VOLT '+str(vol)+'\r\n').encode())
106
                                                       #to change the voltge we need to use "VOLT 1" command
107
       port.write(('CURR '+str(curr)+'\r\n').encode()) #to change the current we need to use "CURR 1" command
108
109
110
      #pumps run
111
     #pump 5.write(b'on\r')
112
     #time.sleep(0.1)
113
     #pump_6.write(b'on\r')
114
     #time.sleep(0.1)
115
     #pump 7.write(b'on\r')
116
      #time.sleep(0.1)
117
      #pump 8.write(b'on\r')
118
      \#time.sleep(0.1)119
       pump 9.write(b'on\r')
120
       time.sleep(0.1)121
122
123
      #send\_syr\_command\_1(f'fr{ff}_1)')124
      #send syr command 2(f'frffr')125
       send_syr_command_3(f'fr{fr_3}')
       #send_syr_command_4(f'fr{fr_4}')
126
       time.sleep(6000)
127
128 def function2():
129
       time.sleep(6000) # Last 3 minutes
130
       files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
```

```
131
132
       val = \emptyset133
134
       #change wavelengths as per product here.
135
       f row=17 #first row of range for wavelength as per IR CSV
       1_row=24 #Last row of range for wavelength as per IR CSV
136
137
        val += fitir extract(files[-1], f row, l row)138
139
        val += ftir extract(files[-2], f row, l row)
140
        val += ftir_extract(files[-3],f_row,l_row)
141
        avg val = val/3142
143
144
       return avg_val
145
146
147 #step 4:grab the line 93 and f9
148 from skopt.optimizer import Optimizer
149
150 #def send syr command 1(command):
      #pump 1.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
151
152
       #pump 1.flush() # Flush the serial buffer
153
154 #def send_syr_command_2(command):
155 #pump 2.write(command.encode() + b'(n') # Send the command to Arduino with a newline character
      #pump 2.flush() # Flush the serial buffer
156
157
158 def send syr command 3(command):
159 pump 3.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
       pump 3.flush() # Flush the serial buffer
160
161 #def send syr command 4(command):
162 #pump 4.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
163 #pump 4.flush() # Flush the serial buffer
164 #step5:in line 96 we have to define the range that (flowrate, voltage, current) (from, to) and after (anytime) appllying changes you need to grab the line 96 and f9
165 #flowrates are in ml/min, voltage in V. Current in Ampere
166 bounds = [(-10.0, -5.0), (0.1, 0.2), (-0.05, -0.049), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.049, 0.050), (14.49, 14.5), (4.99, 5.00)]167 #step 6: grab the Line 100 and f9
168 opter =Optimizer(bounds,base_estimator='gp',n_initial_points=3,acq_func="EI",random_state=np.random.randint(3326))
169
170
```
S173

171 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop ϵ 172 number of cycles =5 173 results = $[$] 174 #flowrates $1 = \lceil \rceil$ 175 #flowrates $2 = \lceil \rceil$ 176 flowrates $3 = []$ 177 #flowrates $4 = \lceil \rceil$ 178 #flowrates $5 = []$ 179 #flowrates $6 = \lceil \rceil$ 180 #flowrates $7 = \lceil \rceil$ 181 #flowrates $8 = []$ 182 flowrates $9 = []$ $183 \text{ vs } = 1$ 184 currents = $[]$ 185 186 product wavelength=True #set to true if product wavelengths being monitored 187 188 if product_wavelength == True: 189 $val=1$ 190 else: 191 $val=-1$ 192 193 # Step 8: Test Tubes on Printer 194 USE PRINTER = True 195 REST_HEIGHT = 200 196 X_HOME = -5 197 Y HOME = 20 198 Z HOME = 175 199 DEFAULT PUMP TIME="1" 200 # Distance between test tubes 201 X SPACING=20 202 Y_SPACING=20 203 # Number of test tubes 204 X ROWS = 11 205 Y COLUMNS = 4 206 207#--------------------code for changing column for run---208 column num=3 #column number of run to try from 209 Y HOME=Y HOME+(column num-1)*Y SPACING 211

```
212 def send cmd(cmd):
213
        print(cmd)
214
        printer.write(f"{cmd}\n".encode("ASCII"))
215
216 def move(x=None, y=None, z=None):<br>217 s = "G0"
218
        if x is not None:
219
           s \leftarrow f''X\{x\}''if y is not None:
220
221
             s \leftarrow f''Y\{y\}''222
        if z is not None:
223s \leftarrow f''Z{z}''224
225
        s+= "F5000"
226
        send_cmd(s)
227
228 def printer positions():
229
        for j in range(Y_COLUMNS):<br>for i in range(X_ROWS):
230
231
                 if j%2==1:
232
                     yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
233
                  else:234
                      yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
235
236 # Run this.237 tube_location = list(printer_positions())
238
239 time.sleep(2)
240
241 try:
242
       for i in range(number_of_cycles):
             move(*tube_location[2*i])
243
             asked = opter ask()244
245
             function (asked[0], asked[1], asked[2], asked[2], asked[3], asked[4], asked[5], asked[6], asked[7], asked[8], asked[9], asked[10])246
             move(*tube_location[2*i+1])
247
             told= function2()
\begin{array}{r} 248 \\ 249 \end{array}print(f"area under the curve in the round {i:.} 2f} = {told:.} 2f)")
250opter.tell(asked,-told*val)
251results.append(told)
rac{252}{252}#flowrates_1.append(asked[0])<br>#flowrates_2.append(asked[1])
253254flowrates_3.append(asked[2])
254<br>255<br>256<br>257
            #flowrates_4.append(asked[
            #flowrates_5.append(asked[4])
            #flowrates_6.append(asked[5])
258
            #flowrates_7.append(asked[6])
259
            #flowrates_8.append(asked[
260
            flowrates_9.append(asked[8])
261
            vs.append(asked[9])
262
            currents.append(asked[10])
263
264
             #dict1 = {"flowrate_2":flowrates_2,"flowrate_3":flowrates_3,"flowrates_4,"flowrates_4,"flowrate_5":flowrates_5,"flowrates_6,"flowrates_6,"flowrates_7,"flowrates_7,"flowrates_7,"flowrates_7,"flowrates_7,"flowrates_7,"flowra
            dict1 = {"flowrate_3":flowrates_3,"flowrate_9":flowrates_9,"voltages":vs,"currents":currents,"area-results":results}
265
266
            df2 = pd.DataFrame(idict1)267
            df2.to_csv("output round "+str(i)+".csv")
268 finally:
269
        \#pump_1.write(b'stop)r')270
        #pump_2.write(b'stop\r'
271
        pump_3.write(b'stop\r')
272
        #pump_4.write(b'stop)r'273
        #pump_5.write(b'off\r')
\frac{274}{274}#pump_6.write(b'off\r')
\frac{275}{276}#pump_7.write(b'off\)']#pump 8.write(b'off\r
        pump_9.write(b'off\r')
278
```
AB4.py (for styrene)


```
45 #step 3: grab the lines from 22 to 90 and presss f9
46 def area_under(data,start,end):
47
     x = np-flip(data.iloc[start:end, 0].to_number())y = np-flip(data.iloc[start:end,1].to_number())48
49
      area = trapz(y, x)50
      return np.abs(area)
5152 def file namer(num):
53
      str1 = str(num)54
      length = int(len((str1)))\frac{1}{2} empt = \frac{1}{2}55
56
      for i in range(5-length):
57empty = empty + '0'58
59
      return empt+str1
60
61
62 def ftir_extract(filename,init,end):
63
      filename = filename
64
65
66
      temp df = pd.read csv(filename)
67
      # nump df = temp df. to numpy()
      area = area_under(temp_df, init, end)
68
69
      # max peak = np.max(nump df[90:120,1])
70
      print(area)71\,72return area
73
74
75 def function(flowrate_1,flowrate_2,flowrate_3,flowrate_4,flowrate_5,flowrate_6,flowrate_7,flowrate_8,flowrate_9,v,i):
76
77
       #set the pumps with the flowrate as the desired flowrate for the function
78
79
      #fr 1 = flowrate 1*1000*pump 1 k #ml/min to microliter/min and syringe correction factor
      #fr 2 = flowrate 2*1000*pump 2 k #ml/min to microliter/min and syringe correction factor
80
      #fr 3 = flowrate 3*1000*pump 3 k #ml/min to microliter/min and syringe correction factor
81
      fr \overline{4} = flowrate \overline{4^*1000^*}pump \overline{4} k #ml/min to microliter/min and syringe correction factor
82
83
     #time.sleep(\theta.1)
84
      #fr_5 = flowrate_5*1000 #ml/min
85
      \#pump_5.write((\overline{f}low:'+str(fr_5) + '\r').encode())86
```

```
87
       \#time.sleep(0.1)88
        #fr 6=flowrate 6*1000 #converting ml/min to ul/min as pump takes this as input val
 89
       #pump_6.write(\overline{('flow:'+ str(fr_6) + ' \r')}.encode())
 90
 91\#time.sleep(\theta.1)92
       #fr_7 = flowrate_7*1000 #ml/min
 93
       #pump_7.write(('flow:'+ str(fr_7) + ' \r').encode())94
 95
        time.sleep(0.1)96
        fr_8=flowrate_8*1000 #converting ml/min to ul/min as pump takes this as input val
 97
        pump_8.write(\overline{('flow:'+ str(fr_8) + '\r')}.encode())
 98
 99
       \#time.sleep(0.1)100
       #fr_9=flowrate_9*1000 #converting ml/min to ul/min as pump takes this as input val
101
       \#pump_9.write(('flow:'+str(fr_9) + '\r').encode())102
       \#time.sleep(0.1)103
104
        #set the com port for potentiostat and set the voltage and current
105
        vol = v106
        curr = i107
        port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                        #to change the voltge we need to use "VOLT 1" command
108
        port.write(('CURR '+str(curr)+'\r\n').encode()) #to change the current we need to use "CURR 1" command
109
110
111
       #pumps run
112
       #pump 5.write(b'on\r')
113
       #time.sleep(0.1)114
       #pump 6.write(b'on\r')
115
      \#time.sleep(0.1)116 #pump_7.write(b'on\r')
117
      #time.sleep(0.1)
118
       pump 8.write(b'on\r')
119 time.sleep(0.1)
       \#pump_9.write(b'on\,')120
121
       #time.sleep(0.1)
122
123
```

```
124
     #send syr command 1(f'frffr 1)')#send\_syr\_command_2(f'fr[fr_2)')125
     #send syr command 3(f'frffr 3)')126
127 send_syr_command_4(f'fr{fr 4}')
     time.sleep(15000)
128
129 def function2():
       time.sleep(15000) # Last 3 minutes
130
       files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
131
132
133
       val = 0134
135
       #change wavelengths as per product here.
136
       f row=17 #first row of range for wavelength as per IR CSV
       1row=24 #Last row of range for wavelength as per IR CSV
137
138
139
       val += ftir extract(files[-1],f row,l row)
140
       val += ftir_extract(files[-2],f_row,1_row)
       val += ftir_extract(files[-3],f_row,1_row)
141
142
143
       avg val = val/3144
145
       return avg_val
146
147
148 #step 4:grab the line 93 and f9
149 from skopt.optimizer import Optimizer
150
151 #def send syr command 1(command):
152
     #pump_1.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
153
      #pump 1.flush() # Flush the serial buffer
154
155 #def send syr command 2(command):
156 #pump 2.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
157 #pump 2.flush() # Flush the serial buffer
158
159 #def send syr command 3(command):
160 #pump_3.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
161
     #pump 3.flush() # Flush the serial buffer
```

```
162 def send syr command 4(command):
        pump 4.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
163
        pump_4.flush() # Flush the serial buffer
164
165 #step5: in line 96 we have to define the range that (flowrate, voltage, current) (from, to) and after (anytime) appllying changes you need to grab the line 96 and f9
166 #flowrates are in ml/min, voltage in V, Current in Ampe.
167 bounds = [(10.0,-5.0),(0.1,0.2),(0.1,0.2), (0.01,0.01), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0.2), (0.1,0168 #step 6: grab the Line 100 and
169 opter = Optimizer (bounds, base estimator='gp', n initial points=3, acq func="EI", random state=np.random.randint(3326))
170
171172 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated
173 number of cycles =5
174 results = []175 #flowrates_1 = []<br>176 #flowrates_2 = []<br>177 #flowrates_3 = []
178 flowrates 4 = []179 #flowrates_5 = []<br>180 #flowrates_6 = []
181 #flowrates 7 = 1182 flowrates \overline{8} = \begin{bmatrix} 1 \end{bmatrix}183 #flowrates_9 = []184 \text{ vs } = []185 currents = [1]186
187 product wavelength=True #set to true if product wavelengths being monitored
188
189 if product wavelength == True:
190 val=1191 else:
192 val=-1193
194 # Step 8: Test Tubes on Printer
195 USE PRINTER = True
196 REST HEIGHT = 200
197 X HOME = -5198 Y HOME = 20199 Z_HOME = 175200 DEFAULT PUMP TIME="1"
201 # Distance between test tubes
202 X SPACING=20
203 Y_SPACING=20
204 # Number of test tubes
```
```
205 X_ROWS = 11206 Y_COLUMNS = 4
207
208 #--------------------code for changing column for run---
209 column num=4 #column number of run to try from
212
213 def send_cmd(cmd):
214
       print(cmd)
215
       printer.write(f"{cmd}\n".encode("ASCII"))
216
217 def move(x=None, y=None, z=None):
218
     s = "G0"if x is not None:
219
       s \leftarrow f''X\{x\}''220
221
     if y is not None:
222
        s \leftarrow f''Y\{y\}''223
     if z is not None:
224
         s \leftarrow f''Z{z}''225
226
      s+= "F5000"
227
       send_cmd(s)
228
229 def printer_positions():
230
     for j in range(Y_COLUMNS):
231
          for i in range(X_ROWS):
232
              if j\%2 == 1:
233
                  yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
234
              else:
235
                  yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
236
237 # Run this.
238 tube_location = list(printer_positions())
239
```


AB5.py (for phenyl acetylene)


```
45 #step 3: grab the Lines from 22 to 90 and presss f9
46 def area under(data.start.end):
47
    x = np.flip(data.iloc[start:end, 0].to numpy())48 \text{ y} = \text{np-flip}(\text{data.iloc}[\text{start:end,1}].\text{to } \text{numpy}())49
     area = trapz(y,x)return np.abs(area)
50
51
52 def file namer(num):
53
      str1 = str(num)54
      length = int(len((str1)))empt =55
56
      for i in range(5-length):
57
          empt = empt+'0'58
59
      return empt+str1
60
61
62 def ftir extract(filename, init, end):
63
64
      filename = filename
65
66
      temp df = pd.read csv(filename)
67
      # nump df = temp \overline{df} . to \text{numpy}()68
      area = area under(temp df, init, end)
69
      # max\_peak = np.max(nump_df[90:120,1])70
      print(area)
71
72
      return area
73
74
75 def function(flowrate 1,flowrate 2,flowrate 3,flowrate 4,flowrate 5,flowrate 6,flowrate 7,flowrate 8,flowrate 9,v,i):
76
77
       #set the pumps with the flowrate as the desired flowrate for the function
78
79
      #fr 1 = flowrate 1*1000*pump 1 k #ml/min to microliter/min and syringe correction factor
      #fr 2 = flowrate 2*1000*pump 2 k #ml/min to microliter/min and syringe correction factor
80
      #fr 3 = flowrate 3*1000*pump 3 k #ml/min to microliter/min and syringe correction factor
81
      #fr 4 = flowrate 4*1000*pump 4 k #ml/min to microliter/min and syringe correction factor
82
83
      time.sleep(0.1)84
      fr 5 = flowrate 5*1000 #ml/min
85
      pump_5.write(('flow:'+ str(fr_5) + '\r').encode())
```
86

```
87
       \#time.sleep(0.1)88
       #fr 6=flowrate 6*1000 #converting ml/min to ul/min as pump takes this as input val
 89
       #pump 6.write(('flow:'+ str(fr 6) + '\r').encode())
 90
 91
       \#time.sleep(0.1)92
       #fr 7 = flowrate 7*1000 #ml/min
 93
       #pump_7.write(('flow:'+str(fr_7) + 'r').encode())94
95
       time.sleep(0.1)96
       fr 8=flowrate 8*1000 #converting ml/min to ul/min as pump takes this as input val
97
       pump 8.write((\overline{('flow:'+ str(fr 8) + '\r')}).encode())
98
99
       \#time.sleep(0.1)#fr 9=flowrate 9*1000 #converting ml/min to ul/min as pump takes this as input val
100
101
       #pump 9.write(('flow:'+ str(fr 9) + 'r'.encode())
102
       \#time.sleep(0.1)103
104
       #set the com port for potentiostat and set the voltage and current
105
       vol = v106
       curr = i107
       port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                         #to change the voltge we need to use "VOLT 1" command
108
       port.write(('CURR '+str(curr)+'\r\n').encode())
                                                         #to change the current we need to use "CURR 1" command
109
110
111
       #pumps run
112
       pump 5.write(b'on\r')
113
       time.sleep(0.1)114
       #pump 6. write(b'on\r')
115
       \#time.sleep(0.1)116
       #pump 7.write(b'on\r')
117
       #time.sleep(0.1)118
       pump 8.write(b'on\r')
119
       time.sleep(0.1)120
       #pump 9. write(b'on\r')
121
       #time.sleep(0.1)122
123
```

```
#send_syr_command_2(f'fr{fr_2}')
125
 126
        #send syr command 3(f'fr{fr 3}')
        #send_syr_command_4(f'fr{fr_4}')
 127
        time.sleep(15000)
 128
 129 def function2():
 130
       time.sleep(15000) # Last 3 minutes
        files = \lceil f for f in listdir(mypath) if isfile(join(mypath, f))]
 131
 132
 133
        val = 0134
 135
        #change wavelengths as per product here.
 136
        f row=17 #first row of range for wavelength as per IR CSV
 137
        1 row=24 #Last row of range for wavelength as per IR CSV
 138
 139
        val += ftir_extract(files[-1],f_row,l_row)
 140
        val += ftir_extract(files[-2],f_row,1_row)
 141
        val += ftir_extract(files[-3],f_row,l_row)
 142
 143
        avg val = val/3144
 145
        return avg val
 146
 147
 148 #step 4:grab the Line 93 and f9
 149 from skopt.optimizer import Optimizer
 150
 151 #def send_syr_command_1(command):
 152 #pump 1.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
 153
       #pump 1. flush() # Flush the serial buffer
 154
 155 #def send_syr_command_2(command):
       #pump 2.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
 156
 157
       #pump 2.flush() # Flush the serial buffer
 158
 159 #def send syr command 3(command):
 160 #pump 3.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
 161 #pump 3.flush() # Flush the serial buffer
 162 #def send syr command 4(command):
 163 #pump 4.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
 164 #pump 4.flush() # Flush the serial buffer
 165 #step5:in line 96 we have to define the range that (flowrate, voltage, current) (from, to) and after (anytime) appllying changes you need to grab the line 96 and f9
 166 #flowrates are in ml/min, voltage in V, Current in Amper
 167 bounds = [(-10.0, -5.0), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.11, 0.2), (0.012, 0.013), (0.1, 0.2), (0.11, 0.2), (0.012, 0.013), (0.1, 0.2), (14.49,14.50), (4.99, 5.00)
 168 #step 6: grab the line 100 and f9
 169 opter =Optimizer(bounds,base_estimator='gp',n_initial_points=3,acq_func="EI",random_state=np.random.randint(3326))
```
170 171 172 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated 173 number of cycles =5 174 results = $\begin{bmatrix} 1 \end{bmatrix}$ 175 #flowrates $1 = []$ 176 #flowrates $2 = \overline{11}$ 177 #flowrates $3 = []$ 178 #flowrates $4 = 11$ 179 flowrates $\overline{5}$ = $\overline{1}$ 180 #flowrates_6 = []
181 #flowrates_7 = [] 182 flowrates $\overline{8} = \overline{11}$ 183 #flowrates $9 = []$ $184 \text{ vs } = []$ 185 currents = $[1]$ 186 187 product_wavelength=True #set to true if product wavelengths being monitored 188 189 if product_wavelength == True: 190 $val=1$ 191 else: 192 $val=-1$ 193 194 # Step 8: Test Tubes on Printer 195 USE PRINTER = True 196 REST_HEIGHT = 200 197 X HOME = -5 $198 \,\mathrm{Y}$ HOME = 20 $199 Z HOME = 175$ 200 DEFAULT PUMP TIME="1" 201 # Distance between test tubes 202 X SPACING=20 203 Y_SPACING=20 $204 \#$ Number of test tubes $205 \times \text{ROWS} = 11$ $206 Y$ COLUMNS = 4 207 208#--------------------code for changing column for run---

```
209 column_num=5 #column number of run to try from
210 Y_HOME=Y_HOME+(column_num-1)*Y_SPACING
--------------
212
213 def send_cmd(cmd):
214
       print(cmd)
215
       printer.write(f"{cmd}\n".encode("ASCII"))
216
217 def move(x=None, y=None, z=None):
218
       s = "60"219
       if x is not None:
220
          s := f''X\{x\}''221
      if y is not None:
222
          s += f"Y{y}"
223
       if z is not None:
224
          s \leftarrow f''Z{z}''225
226
       s+= "F5000"
227
       send_cmd(s)
228
229 def printer_positions():
230
       for j in range(Y_COLUMNS):
          for i in range(X_ROWS):
231
232
               if j\%2 == 1:
                  yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOWE + j * Y_SPACING, Z_HOWE)233
234
               else:
                  yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
235
236
```


AB6.py (for acetonitrile)

```
AB6.py
\Box\overline{1}2^{mm}3 Created on Wed Aug 30 14:48:13 2023
    5 @author: Admin
    6 nm
    \overline{z}\mathbb{R}9 from os import listdir
   10 from os.path import isfile, join
   11 import serial
   12
   13 import numpy as np
   14 import pandas as pd
   15 import time
   16 from scipy.integrate import trapz
   17
   18 #step1: be sure to the address of the files that the ftir data is exported is matching to line 11 (mypath)
   19 mypath = "C:\\Users\\Admin\\Desktop\\ruchi\\Exp 2024-04-11 13-46"
   20 onlyfiles = [f for f in listdir(mypath) if isfile(join(mypath, f))]
   21
   22
   23 #step2: make sure that pump and the potentiostat is correctly addressed in the Line 16 and 17
   24 #pump 1 = serial.Serial("COM10",9600) #hwSyringe Pump
   25 #pump_2 = serial. Serial("COM16", 9600) #Syringe Pump
   26 #pump 3 = serial.Serial("COM19",9600) #Syringe Pump
   27 #pump 4 = serial.Serial('COM15", 9600) #Syringe Pump
   28 #pump 5 = serial.serial for url("COM29", 9600) #HPLC Pump LAN
   29 pump 6 = serial.serial for url("socket://169.254.189.57:10001",9600)
   30 port = serial.Serial("COM1",115200)
   31 #pump 7 = serial.Serial("COM28", 9600) #HPLC Pump
   32 pump 8 = serial.Serial("COM30",9600) #HPLC Pump
   33 \text{ #pump } 9 = \text{serial}.\text{Serial}("CON5", 9600) #HPLC Pump34 printer = serial.Serial("COM14", 115200, timeout=1)
   35
   36 r 1=14.25 #radius of syringe used (50ml, 14.25/20ml, 9.6/10ml, 7.25/5ml, 6.03/3ml, 4/3/1ml, 2.39/60ml, 13.36)
   37 r 2=14.2538r 3=14.25
   39 r 4=14.25
   40 #pump 1 k = (14.25/r 1)^{**}241 #pump 2 k=(14.25/r 2)*242 #pump 3 k=(14.25/r 3)**2
   43 #pump 4 k=(14.25/r 4)**2
   44
```

```
45 #step 3: grab the Lines from 22 to 90 and presss f9
46 def area under(data.start.end):
47
      x = np-flip(data.iloc[start:end, 0].to numpy())48
      y = np-flip(data.iloc[start:end,1].to numpy())49
      area = trapz(v, x)50
      return np.abs(area)
51
52 def file namer(num):
53
      str1 = str(num)54
      length = int(len((str1)))\text{empt} = \cdots55
56
      for i in range(5-length):
57
          empt = empt + '0'58
59
      return empt+str1
60
61
62 def ftir extract(filename, init, end):
63
64
      filename = filename65
      temp_df = pd.read_csv(filename)
66
67
      # nump df = temp df. to numpy()
68
      area = area under(temp df, init, end)69
      # max peak = np.max(nump df[90:120,1])70
      print(area)
7172return area
73
74
75 def function(flowrate 1,flowrate 2,flowrate 3,flowrate 4,flowrate 5,flowrate 6,flowrate 7,flowrate 8,flowrate 9,v,i):
76
77
       #set the pumps with the flowrate as the desired flowrate for the function
78
      #fr 1 = flowrate 1*1000*pump 1 k #ml/min to microliter/min and syringe correction factor
79
80
      #fr 2 = flowrate 2*1000*pump 2 k #ml/min to microliter/min and syringe correction factor
81
      #fr 3 = flowrate 3*1000*pump 3 k #ml/min to microliter/min and syringe correction factor
82
      #fr 4 = flowrate 4*1000*pump 4 k #ml/min to microliter/min and syringe correction factor
83
      \#time.sleep(0.1)84
      #fr 5 = flowrate 5*1000 #ml/min
85
      #pump 5.write(('\overline{f}Low:'+ str(\overline{f}r 5) + '\r').encode())
86
```

```
87
       time.sleep(0.1)fr 6=flowrate 6*1000 #converting ml/min to ul/min as pump takes this as input val
 88
 89
       pump 6.write(('flow:'+ str(fr 6) + ' \r), encode())
 90
 91
       \#time.sleep(0.1)#fr 7 = flowrate 7*1000 #ml/min
 92
       #pump 7.write(('flow:'+ str(fr_7) + '\r').encode())
 93
 94
 95
       time.sleep(0.1)fr_8=flowrate_8*1000 #converting ml/min to ul/min as pump takes this as input val
 96
 97
       pump 8.write(('flow:'+ str(fr 8) + '\r').encode())
 98
99
       \#time.sleep(0.1)#fr 9=flowrate 9*1000 #converting ml/min to ul/min as pump takes this as input val
100
101
       #pump 9.write(('flow:'+ str(fr 9) + '\r').encode())
102
       \#time.sleep(0.1)103
104
       #set the com port for potentiostat and set the voltage and current
105
       vol = vcurr = i106
       port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                         #to change the voltge we need to use "VOLT 1" command
107
108
       port.write(('CURR '+str(curr)+'\r\n').encode()) #to change the current we need to use "CURR 1" command
109
110
111
       #pumps run
112
       #pump 5. write(b'on \r')
113
       \#time.sleep(0.1)114
       pump 6.write(b'on\r')
115
       time.sleep(0.1)116
       #pump 7.write(b'on\r')
       \#time.sleep(0.1)117
       pump 8.write(b'on\r')
118
119
       time.sleep(0.1)120
       #pump 9.write(b'on\r')
121
       \#time.sleep(0.1)122
123
```

```
124
       #send syr command 1(f'frffr 1)'125
       #send syr command 2(f'frffr 2)')126
       #send_syr_command_3(f'fr{fr_3}')
127
       #send_syr_command_4(f'fr{fr_4}')
       time.sleep(8400)
128
129 def function2():
       time.sleep(8400) # Last 3 minutes
130
       files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
131
132
133
       val = 0134
135
       #change wavelengths as per product here.
136
       f row=17 #first row of range for wavelength as per IR CSV
137
       1 row=24 #Last row of range for wavelength as per IR CSV
138
139
       val += fitir extract(files[-1], f row, l row)140
       val += ftir extract(files[-2],f row,l row)
141
       val += ftir_extract(files[-3],f_row,l_row)
142
143
       avg val = val/3144
145
       return avg val
146
147
148 #step 4:grab the line 93 and f9
149 from skopt.optimizer import Optimizer
150
151 #def send syr command 1(command):
152
      #pump_1.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
153
       #pump 1.flush() # Flush the serial buffer
154
155 #def send_syr_command_2(command):
156
      #pump 2.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
157
       #pump 2.flush() # Flush the serial buffer
158
```
159 #def send syr command 3(command): 160 #pump 3.write(command.encode() + b'\n') # Send the command to Arduino with a newline character 161 #pump 3.flush() # Flush the serial buffer 162 #def send syr command 4(command): 163 #pump 4.write(command.encode() + b'\n') # Send the command to Arduino with a newline character 164 #pump 4.flush() # Flush the serial buffer 165 #step5:in line 96 we have to define the range that (flowrate, voltage, current) (from, to) and after (anytime) appllying changes you need to grab the line 96 and f9 166 #flowrates are in ml/min, voltage in V. Current in Ampere 167 bounds = $[(-10.0, -5.0), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.0, 0.2), (0.0, 0.30), (0.1, 0.2), (0.0, 0.30), (0.1, 0.2), (14.49, 14.50), (4.99, 5.00)]$ 168 #step 6: grab the line 100 and f9 169 opter =Optimizer(bounds,base_estimator='gp',n_initial_points=3,acq_func="EI",random_state=np.random.randint(3326)) 170 171 172 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated 173 number of cycles =5 174 results = $[]$ 175 #flowrates_1 = $[]$ 176 #flowrates $2 = \lceil$ 177 #flowrates $3 = []$ 178 #flowrates $4 = \lceil \rceil$ 179 #flowrates $5 = 17$ 180 flowrates $6 = \lceil \rceil$ 181 #flowrates $7 = \lceil$ 182 flowrates $8 = []$ 183 #flowrates_ $9 = []$ $184 \text{ vs } = []$ 185 currents = $[]$ 186 187 product wavelength=True #set to true if product wavelengths being monitored 188 189 if product wavelength == True: 190 $val=1$ 191 else: $val=-1$ 192 193

```
195 USE PRINTER = True
196 REST HEIGHT = 200
197 X HOME = -5198 Y HOME = 20
199 Z HOME = 175
200 DEFAULT PUMP TIME="1"
201 # Distance between test tubes
202 X SPACING=20
203 Y SPACING=20
204 # Number of test tubes
205 X ROWS = 11
206 Y COLUMNS = 4207
208 #--------------------code for changing column for run---
209 column num=6 #column number of run to try from
210 Y_HOME=Y_HOME+(column_num-1)*Y_SPACING
212
213 def send_cmd(cmd):
214
       print(cmd)
215
       printer.write(f"{cmd}\n".encode("ASCII"))
216
217 def move(x=None, y=None, z=None):
218
       s = "G0"219
       if x is not None:
220
           s \leftarrow f''X\{x\}''221
       if y is not None:
222
           s \leftarrow f''Y(y)''223
       if z is not None:
224
           s \leftarrow f''Z{z}''225
226
       s+= "F5000"
227
       send_cmd(s)
228
229 def printer_positions():
230
       for j in range(Y_COLUMNS):
231
           for i in range(X ROWS):232
               if j\%2 == 1:
233
                   yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
234
               else:
235
                   yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
236
```
194 # Step 8: Test Tubes on Printer

AB7.py (for diazoetherate)


```
45 #step 3: grab the lines from 22 to 90 and presss f9
46 def area under(data, start, end):
47
      x = np-flip(data.iloc[start:end, 0].to numpv())48
      y = np-flip(data.iloc[start:end,1].to numpy())49
      area = trapz(y, x)50
      return np.abs(area)
51
52 def file namer(num):
      str1 = str(num)53
      length = int(len((str1)))54
55
      empt = 1156
      for i in range(5-length):
57
          empt = empt + '0'58
59
      return empt+str1
60
61
62 def ftir extract(filename, init, end):
63
64
      filename = filename
65
66
      temp df = pd.read.csv(filename)# nump df = temp df. to numpy()
67
68
      area = area under(temp df, init, end)# max peak = np.max(nump_df[90:120,1])69
70
      print(area)
71
72
      return area
73
74
75 def function(flowrate_1,flowrate_2,flowrate_3,flowrate_4,flowrate_5,flowrate_6,flowrate_7,flowrate_8,flowrate_9,v,i):
76
77
       #set the pumps with the flowrate as the desired flowrate for the function
78
      #fr 1 = flowrate 1*1000*pump 1 k #ml/min to microliter/min and syringe correction factor
79
      #fr 2 = flowrate 2*1000*pump 2 k #ml/min to microliter/min and syringe correction factor
80
81
      #fr 3 = flowrate 3*1000*pump 3 k #ml/min to microliter/min and syringe correction factor
82
      #fr 4 = flowrate 4*1000*pump 4 k #ml/min to microliter/min and syringe correction factor
83
      \#time.sleep(0.1)#fr 5 = flowrate 5*1000 #ml/min
84
85
      #pump 5.write(('flow:'+ str(fr 5) + '\r').encode())
86
```

```
87
       \#time.sleep(0.1)88
       #fr 6=flowrate 6*1000 #converting ml/min to ul/min as pump takes this as input val
 89
       #pump 6.write(('flow:'+ str(fr 6) + '\r').encode())
 90
91
       time.sleep(0.1)fr 7 = flowrate 7*1000 #ml/min
 92
 93
       pump 7.write((\overline{\text{flow}}: + \text{str}(\text{fr } 7) + \sqrt{\text{r}}).encode())
 94
95
       time.sleep(0.1)fr 8=flowrate 8*1000 #converting ml/min to ul/min as pump takes this as input val
96
       pump 8.write((\overline{('flow:'+ str(fr 8) + '\r')}.encode())
97
98
       \#time.sleep(0.1)99
100
       #fr 9=flowrate 9*1000 #converting ml/min to ul/min as pump takes this as input val
       #pump 9.write(('flow:'+ str(fr 9) + '\r').encode())
101
        \#time.sleep(0.1)102
103
104
        #set the com port for potentiostat and set the voltage and current
105
       vol = vcurr = i106
107
       port.write(('VOLT '+str(vol)+'\r\n').encode())
                                                             #to change the voltge we need to use "VOLT 1" command
       port.write(('CURR '+str(curr)+'\r\n').encode()) #to change the current we need to use "CURR 1" command
108
109
110
111
       #pumps run
112
       #pump 5. write(b'on \r')
113
       \#time.sleep(0.1)114
       #pump 6. write(b'on \r')
115
       \#time.sleep(\theta.1)pump 7.write(b'on\r')
116
117
       time.sleep(0.1)pump 8.write(b'on\r')
118
119
       time.sleep(0.1)120
       #pump 9.write(b'on\r')
121
       \#time.sleep(0.1)122
```

```
123
       #send_syr_command_1(f'fr{fr_1}')
124
       #send syr command 2(f'frffr 2)')
125
       #send syr command 3(f'frffr 3)')#send_syr_command_4(f'frffr_4}')
126
127
       time.sleep(6600)
128 def function2():
129
       time.sleep(6600) # Last 3 minutes
       files = [f for f in listdir(mypath) if isfile(join(mypath, f))]
130
131
132
       val = 0133
134
       #change wavelengths as per product here.
135
       f row=17 #first row of range for wavelength as per IR CSV
       1_row=24 #Last row of range for wavelength as per IR CSV
136
137
138
       val += ftir_extract(files[-1],f_row,l_row)
139
       val += ftir_extract(files[-2],f_row,l_row)
140
       val += ftir_extract(files[-3],f_row,l_row)
141
142
       avg val = val/3143
144
       return avg val
145
146
147 #step 4:grab the Line 93 and f9
148 from skopt.optimizer import Optimizer
149
150 #def send syr command 1(command):
151
       #pump 1.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
152
       #pump 1.flush() # Flush the serial buffer
153
154 #def send syr command 2(command):
155
      #pump 2.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
156
      #pump_2.flush() # Flush the serial buffer
157
158 #def send_syr_command_3(command):
159 #pump_3.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
160 #pump_3.flush() # Flush the serial buffer
161 #def send_syr_command_4(command):
```

```
162 #pump 4.write(command.encode() + b'\n') # Send the command to Arduino with a newline character
163 #pump 4.flush() # Flush the serial buffer
164 #step5:in line 96 we have to define the range that (flowrate,voltage,current) (from,to) and after (anytime) appllying changes you need to grab the line 96 and f9
165 #flowrates are in ml/min, voltage in V, Current in Ampere
166 bounds = [(-10.0, -5.0), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.1, 0.2), (0.039, 0.040), (0.039, 0.040), (0.1, 0.2), (14.49, 14.50), (4.99, 5.00)]167 #step 6: grab the line 100 and f9
168 opter =Optimizer(bounds,base_estimator='gp',n_initial_points=3,acq_func="EI",random_state=np.random.randint(3326))
169
170
171 #step7: to selecte number of the cycles that you have to do the experiment and then grab the line 104 to 121 and f9: the closed loop experimentation is initiated
172 number of cycles =5 #max is 5 cycles for 10 tet tubes
173
174 results = []
175 #flowrates 1 = []176 #flowrates_2 = []177 #flowrates_3 = []178 #flowrates 4 = []179 #flowrates_5 = []<br>180 #flowrates_6 = []181 flowrates 7 = []182 flowrates 8 = []183 #flowrates 9 = \lceil184 \text{ vs } = []185 currents = [1]186
187 product_wavelength=True #set to true if product wavelengths being monitored
188
189 if product_wavelength == True:
190 val=1191 else:
192
      val=-1193
194
195
196 # Step 8: Test Tubes on Printer
197 USE PRINTER = True
198 REST HEIGHT = 200
199 X HOME = -5200 Y HOME = 20201 Z HOME = 175
202 DEFAULT_PUMP_TIME="1"
```

```
203 # Distance between test tubes
204 X SPACING=20
205 Y SPACING=20
206 # Number of test tubes
207 X ROWS = 11
208 Y COLUMNS = 4209
210 #--------------------code for changing column for run---
211 column num=7 #column number of run to try from
212 Y_HOME=Y_HOME+(column_num-1)*Y_SPACING
213 #------------
214
215
216 def send cmd(cmd):
217
       print(cmd)
218
       printer.write(f"{cmd}\n".encode("ASCII"))
219
220 def move(x=None, y=None, z=None):
       s = "G0"221
222
       if x is not None:
223
           s \leftarrow f''X\{x\}''224
       if y is not None:
225
           s += f''Y{y}''226
       if z is not None:
227
           s += f''Z{z}''228
229
       s+= "F5000"
230
       send cmd(s)231
232 def printer_positions():
233
       for j in range(Y_COLUMNS):
234
           for i in range(X_ROWS):
235
               if j%2==1:
236
                    yield (X_HOME + (X_ROWS - 1 - i) * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
237
               else:
238
                    yield (X_HOME + i * X_SPACING, Y_HOME + j * Y_SPACING, Z_HOME)
239
240 # Run this.
241 tube_location = list(printer_positions())
242
```


S10.2. General procedure of Integrated AI optimized carbene inserion reaction into diazo ester photochemically.

Figure S55. Schematic diagram of Integrated AI optimized carbene inserion reaction into diazo ester photochemically.

Our interest turned to integrating our protocol into a unified flow process akin to grafting techniques observed in hibiscus plants. In this process, reminiscent of the grafting of branches onto a common trunk, we maintain the same starting material and combine it with different substrates to yield respective products, each designated with a distinct colour. We coined this process "digichemtree," where we sequentially run seven different reagents, each mixed with the starting material to obtain a single product at a time.

Before commencing the experiment, we prepared 0.1 M stock solutions of compound **2a** in both EtOAc and DCE, each stored in separate conical flasks covered with aluminum foil. Similarly, we prepared 0.2 M stock solutions of compounds **3a**, **5a**, and **7a** in EtOAc, each loaded into syringes and connected to pumps. Additionally, 0.2 M stock solutions of compounds **9a**, **11a**, **13a**, and **15a** in DCE were prepared, also stored in separate conical flasks and connected to pumps. After ensuring all connections were secure, we checked communication ports with the master computer. Our integrated continuous flow setup, coupled with AI, was now prepared for operation. Upon executing the code AB1.py, pumps 1 and 9 were activated. Pump 1 dispensed the 0.2 M solution of **3a** in EtOAc, while pump 9 in EtOAc dispensed the 0.1 M solution of **2a**, each at an optimized flow rate of 50 μL/min. The resulting reaction mixture flowed through a 1 mL PFA tubular reactor, exposed to blue LED illumination (70 watts), with a residence time of 10 minutes under 3 bar pressure. Upon completion, the first drop of product emerged, and subsequent solution was collected in individual test tubes over a period of 6000 seconds using tailor made auto fraction collector. Following the first test tube of product, the subsequent ones were reserved for external analysis.

After the successful execution of the AB1.py experiment code, we proceeded to test the AB2.py code. This time, pumps 2 and 9 were activated. Pump 2 delivered the 0.2 M solution of **5a** in EtOAc, while pump 9 dispensed the 0.1 M solution of **2a** in EtOAc, each at an optimized flow rate of 86 μL/min. The resulting reaction mixture traversed through a 1 mL PFA tubular reactor, subjected to intense blue LED illumination (70 watts), with a residence time of 11 minutes under 3 bar pressure. As the reaction concluded, the initial drop of product appeared, and the ensuing solution was meticulously collected in individual test tubes over a span of 3300 seconds utilizing a tailor-made auto fraction collector. Following the first test tube of product, the subsequent ones were reserved for external analysis.

Energized by the successful outcomes of the preceding experiments, we were keen to explore our AB3.py code for a photochemical N-H insertion reaction. Initiating the AB3.py experiment code prompted pump 3 to dispense the 0.2 M solution of **7a** in EtOAc, while pump 9 delivered the 0.1 M solution of **2a** in EtOAc, each flowing at an optimized rate of 46 μL/min. The resultant reaction mixture journeyed through a 1 mL PFA tubular reactor, bathed in vibrant blue LED illumination (70 watts), with a residence time of 10.86 minutes under 3 bar pressure. Upon completion, the droplet of product emerged, and the successive solution was gathered into individual test tubes over a period of 6000 seconds via the tailor-made auto fraction collector. Following the first test tube of product, the subsequent ones were reserved for external analysis.

Having accomplished three successful experimental runs, we were tantalized by the prospect of investigating the feasibility of the remaining experiment codes. We started with clicking on experiment code AB4.py, now pump 4 and pump 8 is activated, pumping the 0.2 M solution of reagent **9a** in DCE with pump 4 and 0.1 M solution of compound **2a** in DCE each flowing at an optimized rate of 15 μL/min. The resultant reaction mixture journeyed through a 1 mL PFA tubular reactor, bathed in vibrant blue LED illumination (70 watts), with a residence time of 32.0 min under 3 bar pressure. Upon completion, the droplet of product emerged, and the successive solution was gathered into individual test tubes over a period of 15000 seconds via the tailor-made auto fraction collector. Following the first test tube of product, the subsequent ones were reserved for external analysis. Next we have run experiment code AB5.py This time, pumps 5 and 8 were activated. Pump 5 delivered the 0.2 M solution of **11a** in DCE, while pump 8 dispensed the 0.1 M solution of **2a** in DCE, each at an optimized flow rate of 12.5 μL/min. The resulting reaction mixture traversed through a 1 mL PFA tubular reactor, subjected to intense blue LED illumination (70 watts), with a residence time of 40 min under 3 bar pressure. As the reaction concluded, the initial drop of product appeared, and the ensuing solution was meticulously collected in individual test tubes over a span of 3300 seconds utilizing a tailormade auto fraction collector. Following the first test tube of product, the subsequent ones were reserved for external analysis.

Then for [3+2] cycloaddtion reaction have done utilizing experiment code AB6.py, in which upon executing, pumps 6 and 8 were activated. Pump 6 dispensed the 0.2 M solution of **13a** in DCE, while pump 8 dispensed the 0.1 M solution of **2a** in DCE, each at an optimized flow rate of 31 μL/min. The resulting reaction mixture flowed through a 1 mL PFA tubular reactor, exposed to blue LED illumination (70 watts), with a residence time of 16.6 minutes under 3 bar pressure. Upon completion, the first drop of product emerged, and subsequent solution was collected in individual test tubes over a period of 8400 seconds using tailor made auto fraction collector. Following the first test tube of product, the subsequent ones were reserved for external analysis.

In last for cross coupling reaction experiment code AB7.py is subjected and pump 7 and pump 8 is activated, pumping the 0.2 M solution of reagent **15a** in DCE with pump 8 and 0.1 M solution of compound **2a** in DCE each flowing at an optimized rate of 40 μL/min. The resultant reaction mixture journeyed through a 1 mL PFA tubular reactor, bathed in vibrant blue LED illumination (70 watts), with a residence time of 12.5 minutes under 3 bar pressure. Upon completion, the droplet of product emerged, and the successive solution was gathered into individual test tubes over a period of 6600 seconds via the tailor-made auto fraction collector. Following the first test tube of product, the subsequent ones were reserved for external analysis.

S12. Troubleshooting

Question: Where to buy AI-system for the reaction optimization?

Answer: No need to buy from any place the python code is available in supporting information.

Question: Where to buy the 3D printer and Arduino board?

Answer: We bought through Amazon.

Question: Any other company photo-flow reactor will work?

Answer: Yes, it'll work but need to change the python code accordingly.

Question: Does other tube id work?

Answer: Other higher tube id (e.g., 2-5 mm) also work, but further need to optimize to get the optimal condition.

Question: Does code will work for the production 100 kg scale?

Answer: Yes, it'll work but further auto-optimization may give you better reaction condition.

Question: Does current code will work with any other company hardware set-up?

Answer: Yes, it'll work but slight modification needed in python code.

Question: Can we replace the In-line IR with other analysis unit?

Answer: Yes, you can replace with HPLC, In-line NMR, GC-MS, LC-MS, XAS etc but the analysis code need to rewrite as per the analysis system manual.

Question: Do we need the super computer to run the auto-reaction optimization?

Answer: We don't need any supercomputer. Any normal PC will work for the reaction autooptimization and on demand synthesis.

Question: Optimization will have effected by the current failure?

Answer: Yes, before starting the experiment make sure system have proper battery back-up.

Question: How many pump we can connect with one AI system?

Answer: Infinite.

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