Genome-scale metabolic rewiring improves titers rates and yields of the non-

native product indigoidine at scale

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Supplementary Figure 1. Expanded metabolic map of cMCS prediction needed to generate growth coupled production of indigoidine from glucose. Related to Figure 1. A total of 14 genes were targeted for CRISPR interference excluding *mqo-I* and *cynT.* Targeted genes responsible for the requisite metabolic reactions indicated from the cMCS analysis are indicated in red. Genes excluded from targeted inhibition are further marked with blue boxes.

Supplementary Figure 2. Characterization of indigoidine production kinetics in *Pseudomonas putida***.**

(a) Kinetic time course of indigoidine production in *P. putida* KT2440. 60mL Cells were cultivated in M9 minimal media under standard conditions. Samples were harvested at the time points indicated to monitor optical density, extracellular glucose, and indigoidine. Sample time points are indicated as hours after 0.3% (w/v) arabinose induction.

(b) Comparison of indigoidine production in *P. putida galETKM* cultivated in 1% glucose or 1% galactose in M9 minimal salt media.

(c-e) Comparison of Carbon/Nitrogen (C/N) ratios for glucose and ammonium sulfate. *P. putida KT2440* carrying an genomically integrated heterologous indigoidine production pathway was cultivated in M9 minimal salt media where the glucose or ammonium sulfate concentration was varied as indicated. Samples were harvested 24 h or 48 h post induction with 0.3% (w/v) arabinose and indigoidine titer was measured as described in Methods. In (c), the same C/N ratio was compared but at two different concentrations of glucose and ammonium sulfate. Data are presented as mean ± SEM for n=5 biologically independent samples.

(f) Evaluation of native tRNA promoters. One hundred (100) bp promoter sequences from *P. putida* KT2440 tRNA ligases immediately upstream of the start ATG were amplified and cloned upstream of a *RBS-mCherry* gene cassette. Constructs were transformed into KT2440 grown in M9 minimal media with three rounds of adaptation. mCherry signal was determined 24 hours of growth in a 24 well deep well plate in a Spectramax m2e plate reader. mCherry fluorescence was compared against background fluorescence in a control strain harboring an empty vector control (pTE219). Data are presented as mean \pm SD for n=5 biologically independent samples except for the *leu* promoter plasmid and empty vector control, which were n=4.

(g) Kinetic analysis of *P. putida* KT2440 indigoidine production strains for growth measured at OD_{600} with multiplex $dCp1/CRISPRi$ plasmids. After transforming the production strain with either the multiplex dCpf1/CRISPRi plasmid or a control dCpf1/CRISPRi plasmid, strains were adapted to growth in M9 1% glucose minimal salt media and then back diluted 1/100x into fresh growth media with 500 μ M IPTG in a 96 well plate format. The OD₆₀₀ was measured every 5 minutes for the duration of the 48 hour incubation period.

(h) Kinetic analysis of *P. putida* growth as in (g), but in wild-type *P. putida* (ie, lacking the indigoidine production pathway).

Source data are provided as a Source Data file.

Supplementary Figure 3. Quantification of CRISPRi efficacy in *P. putida***.** RNAseq (a) and Proteomic (b) validation of dCpf1 multiplex targeted gene knockdown. *P. putida* strains harboring a genomically integrated indigoidine pathway and a plasmid-borne dCpf1/CRISPRi engineered system were prepared for the production of indigoidine (see Methods) and sampled at the indicated time points. No peptides from PP_4947p were detected with the LC-MS/MS method (n.d.). For RNAseq, values were calculated by determining the ratio of Transcripts Per Kilobase Million (TPM) counts for the engineered strain divided by the TPM for the control strain. Independent biological replicates for either the engineered or control strain were averaged before determining the ratio (n=6 for engineered, n=2 for t=0 h control, n=1 for t=12,24,48,72 h timepoints). Samples were analyzed similarly for proteomic analysis (n=4 for both engineered and control strains). Source data are provided as a Source Data file.

Supplementary Figure 4. Replicate fed-batch ambr250® cultivation of CRISPRi engineered product substrate paired indigoidine production strategy. Similar to the results described in Figure 3a, a replicate fed-batch feeding regime was implemented to demonstrate production of indigoidine during exponential phase growth. Instead of a bolus feeding regime as used in Figure 3a, this replicate tested a continuous feeding regime. A similar production of indigoidine during feeding was observed (second gray area on graph) when the control strain did not produce additional indigoidine. Data were analyzed using n>3 technical replicates of sampling from the same bioreactor and presented as mean \pm SD. Source data are provided as a Source Data file.

Supplementary Figure 5. Output from computational growth coupling metabolic modeling. cMCS predictions for 417 metabolites that could be coupled to at least 10% biomass yield and a minimum production yield of 10%, 50% and 80% MTY. The number of reactions in each cut set (Z) and number of cut sets (n) for each of the 417 metabolites is shown in a and b, respectively. Each metabolite is represented as a triangle and the number of cut sets is shown in blue whereas the size of the cut set is shown in pink. The black line marks the median for each case. Data was plotted using GraphPad Prism 8.

Supplementary Figure 6. Characterization of indigoidine. A standard curve used for indigoidine quantification relating absorbance at a wavelength of 612 nm to indigoidine concentration dissolved in DMSO. In each equation Y is indigoidine concentration in g/L and x is absorbance at 612 nm (see Methods). The plotted standard curve for indigoidine purified from *P. putida* was repeated >3 times over from freshly generated microbial cultures over the course of several months. A standard curve was also generated using the same pathway genes expressed in *E coli*. Data are presented as mean \pm SD for n=6 independent absorbance measurements at each concentration. Raw values are included in the supplementary source file. R^2 value was calculated using GraphPad Prism 8. Source data are provided as a Source Data file.

Supplementary Figure 7. Analysis of indigoidine purity by H-NMR. Indigoidine was extracted from *P. putida* and *E. coli* harboring expression the heterologous pathway and purified as described (see Methods). Indigoidine purified from either host shows similar purity. A representative trace from n=3 biologically independent samples is shown.

Supplementary Table 1. Potential for product substrate pairing for all metabolites in *P. putida* **KT2440 and** *E. coli* **MG1655 using glucose as the sole carbon source.**

Supplementary Table 2. Comparison of industrially relevant hosts for glutamine and indigoidine production with respect to maximum theoretical yields.

^aMaximum Theoretical Yield (MTY) calculated using ^bconstraints for each Genome-scale Metabolic Model (GSMM) to best represent cell phenotype.

^cNo indigoidine formation if flavin mononucleotide (FMN) is limiting.

Supplementary Table 3. Analysis of all the computed cMCS in this study for growth coupled glutamine production as a proxy for indigoidine.

^aMTY: Maximum theoretical yield (mole of product per mole of glucose)

^bYBS: Biomass yield (gDW per mmol of glucose)

^cKO: Knockout

Supplementary Table 4. Analysis of suitable starting carbon sources to determine compatible carbon sources for cultivation for substrate-product pairing with indigoidine.

Supplementary Table 5. Comparison of growth coupling strategies for α**-ketoglutarate using OptKnock and cMCS algorithms to identify gene cut sets to improve indigoidine yield.**

^aYPS: Product yield (mole of product per mole of glucose)

^bYBS: Biomass yield (gDW per mmol of glucose)

Supplementary Table 6. Comparison of growth coupling strategies for glutamine using OptKnock and cMCS algorithms to identify gene cut sets to improve indigoidine yield.

^aYPS: Product yield (mole of product per mole of glucose)

 bYBS : Biomass yield (gDW per mmol of glucose)</sup>

Supplementary Table 7. Comparison of industrially relevant hosts with respect to the highest experimentally reported indigoidine titers.

a When cells are fed glucose from a continuous feeding regime (i.e. exponential growth phase). \overline{b} When cells are fed glucose in batch mode culture. (i.e. stationary phase).

^c Refer to Supplementary Table 2 for theoretical yield calculations.

Supplementary Table 8. Strains used in this study.

^a Genomic integrations are targeted to an intergenic region adjacent to the indicated locus.
^b nt: non-targeting gRNA sequence with no homology to the *P. putida* KT2440 genome.

^c Refer to Supplementary Data 1 for sequences of targeted genes with sequences for targeting

gRNAs, promoters, and terminators used in the multiplex array. d *neo* is also known as APH(3')-II family aminoglycoside O-phosphotransferase and confers resistance to 50 µg/mL kanamycin in *P. putida*.

Supplementary Table 9. Primers used in this study.

Supplementary Method 1. Implementation of Optknock.

OptKnock^{[11](http://sciwheel.com/work/citation?ids=2380410&pre=&suf=&sa=0)} was implemented on iJN[14](http://sciwheel.com/work/citation?ids=6682954&pre=&suf=&sa=0)62 using COBRA Toolbox 3.0^{14} on MATLAB 2017b platform. Gurobi Optimizer 8.1 (http://www.gurobi.com/) was used as the MILP solver. Additional constraints including aerobic condition, glucose uptake, ATP maintenance demand, excretion of byproducts were kept the same as used for cMCS computation (Main methods section). Export reactions and spontaneous reactions were excluded from the targetable reaction set. Additional constraints including maximum product yield (80% of MTY) and minimum demanded biomass yield at 10% of maximum biomass yield were also specified in order to constrain the desired design space. The maximum number of reaction deletions that were tested ranged from 3 to 20. Simulations were allowed to run upto 2 hrs, the same time assigned for cMCS computation. 40 solution sets with 11 to 18 deletions were found, all with 'non unique', not growth coupled, production phenotypes. None of them improved indigoidine production. The comparable solution set, although non-unique and not growth coupled, has been tabulated in **Supplementary Tables 5 and 6**.

Supplementary Method 2. Determination of cell growth or fluorescence with microtiter plate reader based assays.

Growth was monitored in a Molecular Devices (San Jose, CA) Spectramax m2e plate reader plate reader by measuring optical density at OD_{600} at 5-min intervals over a 48 hour interval. Strains of the appropriate genotype were struck to single colonies from glycerol stocks and first grown on LB agar media supplemented with the appropriate antibiotic and prepared for adaptation in liquid M9 media with 1% glucose as described for indigoidine production assays. The plate was sealed using a Breath-easy sealing membrane (Sigma-Aldrich) to ensure optimal oxygen exchange. Using the Softmax Pro plate v7.0 reader control package, the plate was incubated with constant shaking and the temperature was held to 30 ˚C for the duration of the experiment. For fluorescence quantitation of native P. putida promoters using detection of *RBSmCherry*, cells of the appropriate genotype were prepared as above, but instead were cultivated in a 30˚C warm room using the same 24 well deep well plate used for indigoidine production assays. When cells had completed adaptation, cultures were back-diluted to an initial OD_{600} of \sim 0.1 and allowed to grow for 24 hours. 100 μ L of each culture was then transferred to a 96 well microtiter dish and fluorescence using the monochromator was measured with a wavelength pair of 587 nm / 610 nm for excitation / emission.

Supplementary Discussion 1. Glutamate metabolism in *P. putida.*

In *P. putida* central metabolism*,* glutamate can be converted into α-ketoglutarate, fumarate, aspartate, proline, ornithine, and glutamine. These characterized pathways result in flux redistribution towards α-ketoglutarate, fumarate or aspartate, in addition to the pathways that are targeted as shown in **Supplementary Figure 1**. The first two metabolites (α -ketoglutarate, fumarate) redirect flux toward TCA whereas biosynthesis of aspartate would require equimolar amounts of oxaloacetate. If the biomass yields are the same as that of WT, based on biomass equation formulation used in the genome scale model, in the engineered strain about 3.3% glutamine and 4% (glutamate equivalents) accumulated intracellularly would be sufficient for 10% biomass yield. Using the experimentally observed indigoidine yields in WT and engineered *P. putida* strains, we find that only about 10% of MTY glutamine in WT is converted to indigoidine whereas 70% of the MTY glutamine was successfully converted to indigoidine in the engineered strain. The set of exchange reactions that might *in silico* impact growth coupled indigoidine production in the engineered strain are for pyruvate, α-ketoglutarate, leucine, valine, citrate, isocitrate and D-alanine. Biosynthesis of all these metabolites are upstream of glutamate. Our HPLC method did not detect any organic acids. Of the remaining three amino acids, leucine, valine and D-alanine are synthesized from pyruvate. Blocking these pathways above would generate auxotrophies for the indicated metabolites.

Supplementary References

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