

Comparison of atom mapping algorithms

To be able to execute this MATLAB live script, it is necessary to have installed Chemexon license and MATLAB 2016b. The code should be executed in the folder where the MATLAB live script is.

1. Standarize reactions

1.1 Defining directories

```
h = waitbar(0, 'Procesing files...');
sandarizerFileDir='~/standarizerFiles';
predictions={'RDT', 'DREAM', 'AutoMapper', 'CLCA', 'MWED', 'ICMAP'};
```

1.2 For each file on each folder standarize the RXN file

```
for k=1:numel(predictions)
    predictionDir=[pwd '/Raw/' predictions{k}];
    fnames=dir([predictionDir '/*.rxn']);
    newDir=[pwd '/standarizedRXN/' predictions{k}];
    mkdir(newDir)
    mkdir([newDir '/notStandarized'])

    for i=1:length(fnames)
        waitbar(i / length(fnames))
        try
            rxn=fnames(i).name;
```

1.3 Convert the RXN file in SMILES format (canonical order)

```
command = ['molconvert smiles ' [predictionDir '/' rxn] ' -o ' [newDir '/' rxn(1:
[status,cmdout] = system(command);
```

1.4 Reassigne the order of the molecules in the reactions in the substrates and products (from smaller to bigger)

```
sortMolecules([newDir '/' rxn(1:end-4) '.smiles'])
return
```

1.5 Convert SMILES to RXN for the comparison

```
command = ['molconvert rxn ' [newDir '/' rxn(1:end-4) '.smiles'] ' -o ' [newDir '/'
[status,cmdout] = system(command);
delete([newDir '/' rxn(1:end-4) '.smiles'])
```

1.6 Assign ascending atom mappings

```
switch k
    case 4
        ascendingCLCA([newDir '/' rxn(1:end-4) '.rxn'])
    otherwise
        ascendingAtomMaps([newDir '/' rxn(1:end-4) '.rxn'])
end
```

1.7 Calculate equivalent atoms in the molecule

```
        symmetryRXN([newDir '/' rxn(1:end-4) '.rxn'])
    catch
        try
            movefile([predictionDir '/' rxn],[newDir '/notStandardized'])
        catch
            end
        end
    end
end
end
end
close(h)
```

2. RXNs comparison

2.1 Load Recon 3D

```
recon3=[pwd '/Recon3.mat'];
load (recon3)
model=modelName;
a=cell({' '});
```

2.2 Get the address of all the RXN files to compare

```
processedPredictions= ['standardizedRXN/'];
AM_DataBases={'Curated' 'RDT' 'DREAM' 'Chemaxon' 'CLCA' 'MWED' 'ICmap'};
```

2.3 Get all the names of the manually curated files

```
fnames=dir([processedPredictions AM_DataBases{1} '/*.rxn']);
```

2.3 Get all the atom mappings for all the files in all folders as arrays

```
for j=1:numel(AM_DataBases)
    for k=1:numel(fnames)
        file=[fullyProcessedDir AM_DataBases{j} '/' char(fnames(k).name)];
        if exist(file, 'file') == 2
            rxnFile = regexp( fileread(file), '\n', 'split');
            begmol=strmatch('$MOL',rxnFile);
            counter=0;
            for l=1:length(begmol)
                for m=1:str2double(rxnFile{begmol(l)+4}(1:3))
                    counter=counter+1;
                    atoms{counter}=strtrim(rxnFile{begmol(l)+m+4}(61:63));
                end
            end
            eval(sprintf('mappingNumbers(%d).atoms%d=atoms;',k,j));
            clear atoms
        else
            eval(sprintf('mappingNumbers(%d).atoms%d=a;',k,j));
        end
        if j==1
            arrayLength(j)=length(mappingNumbers(j).atoms1);
        end
    end
end
```

```
end
```

2.4 Convert the obtained arrays into strigs

```
mappingCells = num2cell(cellfun(@(c) [c{:}], permute(struct2cell(mappingNumbers), [3 1 2]), 'U  
idz = cellfun('isempty', vertcat(mappingCells{:}));
```

2.5 Comparison of predicted reactions to manually curated reactions (Table)

```
fun = @(x)unique(x, 'first');  
[~,idx,idy] = cellfun(fun,mappingCells, 'UniformOutput', false);  
comparisonMatrix = cellfun(@(x,y)x(y),idx,idy, 'UniformOutput', false);  
comparisonMatrix = vertcat(comparisonMatrix{:});  
comparisonMatrix=vec2mat(comparisonMatrix,7);  
comparisonMatrix(idz) = NaN;
```

2.6 Calculate percentage of similarity of predictions and manually curated reactions

```
for j=2:numel(AM_DataBases)  
    totalRxn=find(~isnan(comparisonMatrix(:,j)));  
    correctRxn=find(comparisonMatrix(totalRxn,j)==1);  
    percentages(j-1)=(length(correctRxn)/length(totalRxn))*100;  
end
```

2.7 Create figure of comparison

```
figure(1)  
bar(percentages)  
title('Accuracy of predictions')  
xlabel('Algorithms')  
ylabel('Percentage of accuracy')  
set(gcf, 'color', 'w');  
ax = gca;  
ax.XTick = 1:6;  
ax.XTickLabel = {'RDT', 'DREAM', 'AutoMapper', 'CLCA', 'MWED', 'ICMAP'};
```

2.8 Accuracy per atoms

```
D = comparisonMatrix-1;  
D(bsxfun(@or,idz,idz(:,1))) = NaN;  
m=D;  
for i=1:length(mappingNumbers)  
    V(i)=length(mappingNumbers(i).atoms1);  
end  
m(isnan(m))=0;  
AMcorrect=100-sum(m)./sum(repmat(V.',1,7).*isfinite(D))*100
```

3. Accuracy by reaction type

3.1 Use table created in 2.5 and data in Recon 3D to calculate the accuracy per reaction type

```

totalEC=zeros(6,7);
correctEC=totalEC;
for i=1:numel(fnames)
    file=fnames(i).name;
    ecNumber = model.rxnECNumbers{strmatch(file(1:end-4), model.rxns, 'exact')};
    if ~isempty(ecNumber)
        index=regexp(ecNumber, '\d');
        totalEC(str2double(ecNumber(index(1))),:)= totalEC(str2double(ecNumber(index(1))),:)+~
        correctEC(str2double(ecNumber(index(1))),:)= correctEC(str2double(ecNumber(index(1))),
    end
end
percentageMatrixEC=round(correctEC./totalEC*100);
percentageMatrixEC(:,1)=[];
percentageMatrixEC(7,:)=percentages;
totalEC(:,1)=[];
totalEC(7,:)=[512 512 512 488 477 496];

```

3.2 Create accuracy per reaction type figure

```

figure(3)
hb = bar(percentageMatrixEC);
set(gcf, 'color', 'w');
title('Similarity based on reaction type')
legend('RDT', 'DREAM', 'AutoMapper 5.0.1', 'CLCA', 'MWED', 'ICMAP', 'location', 'northeastoutside')
xlabel('Reaction type')
ylabel('Percentage of accuracy')
ax = gca;
ax.XTick = 1:7;
ax.XTickLabel = {'Oxidoreductases', 'Transferases', 'Hydrolases', 'Lyases', 'Isomerases', 'Ligases'};

barWidth = hb.BarWidth;
numCol = size(percentageMatrixEC,2);
cnt = 0;
for ii = totalEC'
    cnt = cnt + 1;
    xPos = linspace(cnt - barWidth/2, cnt + barWidth / 2, numCol+1);
    idx = 1;
    for jj = xPos(1:end-1)
        val = totalEC(cnt,idx);
        y = percentageMatrixEC(cnt,idx);
        text(jj, y + 1, num2str(val));
        idx = idx + 1;
    end
end
end

```

4. Comparison of all predicted reactions

4.1 Obtain all the reactions

```

predictionsDirs={prcessedPredictions AM_DataBases{1}};
for i = 2:numel(AM_DataBases)
    predictionsDirs{i}=[prcessedPredictions AM_DataBases{i}];
end
for k = 1:numel(predictionsDirs)
    fnames = dir(fullfile(predictionsDirs{k}, '/*.rxn')) ; % fullfile for cross-OS compatibility
    rxns{k} = {fnames.name};
end
rxns = unique([rxns{:}]);

```

4.2 Assign EC number if possible

```
for j=1:length(rxns)
    comparison(j).rxn=rxns{j}(1:end-4);
    ecNumber= strmatch(comparison(j).rxn, model.rxns,'exact');
    comparison(j).ECnumber=modelName.rxnECNumbers(ecNumber(1));
end
```

4.3 Reads the atom mappings for all the RXN file in all the directories and save them as strings

```
a=cell({' '});
for i=1:length(AM_DataBases)
    for j=1:length(rxns)
        file=[fullyProcessedDir AM_DataBases{i} '/' rxns{j}];
        if exist(file, 'file') == 2
            rxnFile = regexp( fileread(file), '\n', 'split');
            begmol=strmatch('$MOL',rxnFile);
            counter=0;
            for k=1:length(begmol)
                for l=1:str2double(rxnFile{begmol(k)+4}(1:3))
                    counter=counter+1;
                    atoms{counter}=strtrim(rxnFile{begmol(k)+l+4}(61:63));
                end
            end
            eval(sprintf('mappingNumbers(%d).atoms%d=atoms;',j,i));
            clear atoms
        else
            eval(sprintf('mappingNumbers(%d).atoms%d=a;',j,i));
        end
        if i==2
            arrayLength(j)=length(mappingNumbers(j).atoms2);
        end
    end
end
end
```

4.4 Is created a matrix for the comparisons where cols represent the algorithms and rows atom mapped reactions

```
mappingCells = num2cell(cellfun(@(c) [c{:}], permute(struct2cell(mappingNumbers), [3 1 2]), 'U', 1));
idz = cellfun('isempty',vertcat(mappingCells{:}));
```

4.5 Comparison of all predictions

```
fun = @(x)unique(x,'first');
[~,idx,idy] = cellfun(fun,mappingCells,'UniformOutput',false);
comparisonMatrix = cellfun(@(x,y)x(y),idx,idy,'UniformOutput',false);
comparisonMatrix = vertcat(comparisonMatrix{:});
comparisonMatrix=vec2mat(comparisonMatrix,6);
comparisonMatrix(idz) = NaN;
for i=1:length(comparison)
    for j=1:6
        eval(sprintf('comparison(%d).DB%d=comparisonMatrix(%d,%d);',i,j,i,j));
    end
end
```

```
end
```

4.6 The percentage of similarity of each of the algorithms (upper triangular) and the times compared (lower triangular) are calculated

```
a = permute(comparisonMatrix,[3,2,1]);
b = permute(comparisonMatrix,[2,3,1]);
accuracyRxn = sum(bsxfun(@eq,a,b),3);
totalRxn = sum(~isnan(bsxfun(@plus,a,b)),3);
out = tril(totalRxn,-1) + round(triu(accuracyRxn./totalRxn'*100,1))
```

Local functions

sortMolecules

```
function sortMolecules(filename)

% The the molecules in the substras and products in the SMILES are sorted by size
%
% sortMolecules(filename)
%
% INPUT
% filename                Name of the SMILES file.
%
% OUTPUT
% Overwrite a SMILES file with sorted molecules
%
% By:    German Andres Preciat Gonzalez
% Date:  11/11/2015

smilesFile = fileread(filename);
formula=strsplit(strtrim(smilesFile),'>>');

newSmiles=[];
for i=1:2
    molecules=strsplit(strtrim(formula{i}),'.');
    sort(:,1)=cellfun(@(x)length(x),molecules)';
    [l a]=size(sort);
    sort(:,2)=1:l;
    sort=sortrows(sort);
    for j=1:l
        if j==l
            if i==1
                newSmiles=[newSmiles molecules{sort(j,2)} '>>'];
            else
                newSmiles=[newSmiles molecules{sort(j,2)}];
            end
        else
            newSmiles=[newSmiles molecules{sort(j,2)} '.'];
        end
    end
    clear sort
end
fid2 = fopen(filename, 'w');
fprintf(fid2, '%s\n',newSmiles);
fclose(fid2);
```

```
end
return
```

ascendingAtomMaps

```
function ascendingAtomMaps(filename)

% The atom mappings of predictions are calculated ascendantly
%
% ascendingAtomMaps(filename)
%
% INPUT
% filename                Name of the rxn file.
%
% OUTPUT
% Overwrite a .rxn with ascendantly atom mappings
%
% By:    German Andres Preciat Gonzalez
% Date:  11/11/2015

rxnFile = regexp( fileread(filename), '\n', 'split');
substrates=str2double(rxnFile{5}(1:3));           % Extracts the # of molecules (substrates)
products=str2double(rxnFile{5}(4:6));
begmol=strmatch('$MOL',rxnFile);

noOfAtoms=0;
for i=1:substrates
    for k=1:str2double(rxnFile{begmol(i)+4}(1:3)) % number of atoms in the molecule
        noOfAtoms=noOfAtoms+1;
        if str2double(rxnFile{begmol(i)+k+4}(61:63))~=0
            oldMapNum(str2double(rxnFile{begmol(i)+k+4}(61:63)));
            rxnFile{begmol(i)+k+4}(61:63)='  ';
            rxnFile{begmol(i)+k+4}(61+3-length(num2str(noOfAtoms)):63)=num2str(noOfAtoms);
        end
    end
end

for i=substrates+1:substrates+products
    for k=1:str2double(rxnFile{begmol(i)+4}(1:3))
        atomMapNum=str2double(rxnFile{begmol(i)+k+4}(61:63));
        if atomMapNum~=0
            atomMatrixIndex=find(oldMapNum==atomMapNum);
            if ~isempty(atomMatrixIndex)
                rxnFile{begmol(i)+k+4}(61:63)='  ';
                rxnFile{begmol(i)+k+4}(61+3-length(num2str(atomMatrixIndex(1))):63)=num2str(at
                atomMatrixIndex(1)=[];
            else
                atomMatrixIndex=999;
                rxnFile{begmol(i)+k+4}(61:63)='  ';
                rxnFile{begmol(i)+k+4}(61+3-length(num2str(atomMatrixIndex(1))):63)=num2str(at
            end
        end
    end
end

fid2 = fopen(filename, 'w');
fprintf(fid2, '%s\n', rxnFile{:});
fclose(fid2);
```

acsendingAtomMaps

```
function acsendingCLCA(filename)

% The atom mappings of CLCA predictions are calculated ascendantly
%
% acsendingCLCA(filename)
%
% INPUT
% filename           Name of the rxn file.
%
% OUTPUT
% Overwrite a .rxn with ascendantly atom mappings
%
% By:      German Andres Preciat Gonzalez
% Date:    11/11/2015

rxnFile = regexp( fileread(filename), '\n', 'split');

substrates=str2double(rxnFile{5}(1:3));
products=str2double(rxnFile{5}(4:6));

begmol=strmatch('$MOL',rxnFile);

% create a matrix with previous and acending values
atom=0;
for i=1:substrates
    for k=1:str2double(rxnFile{begmol(i)+4}(1:3)); % number of atoms in the molecule
        atom=atom+1;
        atomMapNum(atom,1)=str2double(rxnFile{begmol(i)+k+4}(61:63));
        atomMapNum(atom,2)=atom;
    end
end

% reassign equivalent atoms
for i=1:atom
    indexes=find(atomMapNum(:,1)==atomMapNum(i,1));
    for j=1:length(indexes)
        if indexes(j)~=i
            atomMapNum(indexes(j),2)=atomMapNum(indexes(1),2);
        end
    end
    if atomMapNum(i,1)==0
        atomMapNum(i,2)=0;
    end
end

% assign in RXN file
% products
c=0;
for i=1:substrates
    for k=1:str2double(rxnFile{begmol(i)+4}(1:3)); % number of atoms in the molecule
        c=c+1;
        rxnFile{begmol(i)+k+4}(61:63)='    ';
        rxnFile{begmol(i)+k+4}(61+3-length(num2str(atomMapNum(c,2))):63)=num2str(atomMapNum(c,2));
    end
end

% substrates
```



```

for i=substrates+1:substrates+products
    for k=1:str2double(rxnFile{begmol(i)+4}(1:3)); % number of atoms in the molecule
        newMap=find(atomMapNum(:,1)==str2double(rxnFile{begmol(i)+k+4}(61:63)));
        rxnFile{begmol(i)+k+4}(61:63)='';
        rxnFile{begmol(i)+k+4}(61+3-length(num2str(atomMapNum(newMap(1),2))):63)=num2str(atomM
    end
end

fid2 = fopen(filename, 'w');
fprintf(fid2, '%s\n', rxnFile{:});
fclose(fid2);

```

Symmetry

```

function symmetryRXN(filename,rxnFilePath)
% Calculate the chemically equivalent atoms in a reactions
%
% symmetryRXN(filename,rxnFilePath)
%
% INPUT
% filename           Name of the rxn file.
% rxnFilePath       Path of the rxn file (optional).
%
% OUTPUT
% Overwrite a .rxn file with the chemically equivalent atoms calculated problem solve.
%
% By:      German Andres Preciat Gonzalez
% Date:    11/11/2015

if ~exist('rxnFilePath','var') %
    rxnFilePath=[pwd filesep]; %
end % If there is not path the program

cd(rxnFilePath)
rxnFile = regexp( fileread(filename), '\n', 'split');
Substrates=str2double(rxnFile{5}(1:3)); % Extracts the # of molecules (substractes
Products=str2double(rxnFile{5}(4:6));
begmol=strmatch('$MOL',rxnFile);

for i=1:Substrates
    numberOfAtoms=str2double(rxnFile{begmol(i)+4}(1:3));
    numberOfBonds=str2double(rxnFile{begmol(i)+4}(4:6));
    if numberOfBonds~=0
        if numberOfBonds==1
            replaceMatrix(1)=str2double(rxnFile{begmol(i)+5}(61:63));
            replaceMatrix(2)=str2double(rxnFile{begmol(i)+6}(61:63));
            rxnFile{begmol(i)+6}(61:63)='';
            rxnFile{begmol(i)+6}(61+3-length(num2str(replaceMatrix(1))):63)=num2str(replaceMatrix(1));
            for j=Substrates+1:Substrates+Products
                for k=1:str2double(rxnFile{begmol(j)+4}(1:3))
                    if str2double(rxnFile{begmol(j)+4+k}(61:63))==replaceMatrix(2)
                        rxnFile{begmol(j)+k+4}(61:63)='';
                        rxnFile{begmol(j)+k+4}(61+3-length(num2str(replaceMatrix(1))):63)=num2str(replaceMatrix(1));
                    end
                end
            end
        else
            for j=1:numberOfBonds
                bondmatrix(j,1)=str2double(rxnFile{begmol(i)+4+numberOfAtoms+j}(1:3));
            end
        end
    end
end

```

```

    bondmatrix(j,2)=str2double(rxnFile{begmol(i)+4+numberOfAtoms+j}(4:6));
end
% find sigle atom graphs
posSimAt=find(hist(bondmatrix(:)',unique(bondmatrix(:)'))==1);
% find with which atom they are conected
posSimAt(2,:)=zeros(1,length(posSimAt));
savePos=zeros(1,length(posSimAt));
for j=1:length(posSimAt)
    [x,y]=find(bondmatrix==posSimAt(1,j));
    savePos=x;
    [x,y]=find(bondmatrix(savePos,:)~=posSimAt(1,j));
    posSimAt(2,j)=bondmatrix(savePos,y);
end
a=unique(posSimAt(2,:));
if length(a)~=1
    c=find(hist(posSimAt(2,:)',a')>1);
    vector=zeros(1,length(c));
    for j=1:length(c)
        vector(j)=a(c(j));
    end
else
    vector=a;
end

count=1;
for j=1:length(vector)
    for k=1:length(posSimAt)
        if posSimAt(2,k)==vector(j)
            vtc(count)=posSimAt(1,k);
            count=count+1;
        end
    end
    for k=1:length(vtc)
        atMatrix(k,2)=vtc(k);
        atMatrix(k,1)=str2double(rxnFile{begmol(i)+4+vtc(k)}(61:63));
    end
    atMatrix = sortrows(atMatrix);
    vtc=atMatrix(:,2);
    if length(vtc)~=1
        if isequal(rxnFile{begmol(i)+4+vtc(1)}(32:33),rxnFile{begmol(i)+4+vtc(
            numToBeAdd=str2double(rxnFile{begmol(i)+4+vtc(1)}(61:63));
        for k=2:length(vtc)
            numToBeCh=str2double(rxnFile{begmol(i)+4+vtc(k)}(61:63));
            rxnFile{begmol(i)+4+vtc(k)}(61:63)='    ';
            rxnFile{begmol(i)+4+vtc(k)}(61+3-length(num2str(numToBeAdd)):63)=num2str(numToBeCh);
        for l=begmol(Substrates+1):length(rxnFile)
            products=strsplit(strtrim(rxnFile{l}));
            if length(rxnFile{l})==69 && str2double(rxnFile{l})(61:63)==numToBeAdd
                rxnFile{l}(61:63)='    ';
                rxnFile{l}(61+3-length(num2str(numToBeAdd)):63)=num2str(numToBeCh);
            end
        end
    end
end
clear vtc atMatrix
count=1;
end
clear posSimAt bondmatrix vector a c

```

```

end
end

% Assign chemically equivalent atoms in products
for i=1+Substrates:Substrates+Products
    numberOfAtoms=str2double(rxnFile{begmol(i)+4}(1:3));
    numberOfBonds=str2double(rxnFile{begmol(i)+4}(4:6));
    if numberOfBonds~=0
        if numberOfBonds==1
            replaceMatrix(1)=str2double(rxnFile{begmol(i)+5}(61:63));
            replaceMatrix(2)=str2double(rxnFile{begmol(i)+6}(61:63));
            rxnFile{begmol(i)+6}(61:63)='    ';
            rxnFile{begmol(i)+6}(61+3-length(num2str(replaceMatrix(1))):63)=num2str(replaceMatrix(1));
            for j=Substrates+1:Substrates+Products
                for k=1:str2double(rxnFile{begmol(j)+4}(1:3))
                    if str2double(rxnFile{begmol(j)+4+k}(61:63))==replaceMatrix(2)
                        rxnFile{begmol(j)+k+4}(61:63)='    ';
                        rxnFile{begmol(j)+k+4}(61+3-length(num2str(replaceMatrix(1))):63)=num2str(replaceMatrix(1));
                    end
                end
            end
        else
            for j=1:numberOfBonds
                bondmatrix(j,1)=str2double(rxnFile{begmol(i)+4+numberOfAtoms+j}(1:3));
                bondmatrix(j,2)=str2double(rxnFile{begmol(i)+4+numberOfAtoms+j}(4:6));
            end
            % find single atom graphs
            posSimAt=find(hist(bondmatrix(:)',unique(bondmatrix(:)'))==1);
            % find with which atom they are connected
            posSimAt(2,:)=zeros(1,length(posSimAt));
            savePos=zeros(1,length(posSimAt));
            for j=1:length(posSimAt)
                [x,y]=find(bondmatrix==posSimAt(1,j));
                savePos=x;
                [x,y]=find(bondmatrix(savePos,:)~=posSimAt(1,j));
                posSimAt(2,j)=bondmatrix(savePos,y);
            end
            a=unique(posSimAt(2,:));
            if length(a)~=1
                c=find(hist(posSimAt(2,:)',a')>1);
                vector=zeros(1,length(c));
                for j=1:length(c)
                    vector(j)=a(c(j));
                end
            else
                vector=a;
            end
            count=1;
            for j=1:length(vector)
                for k=1:length(posSimAt)
                    if posSimAt(2,k)==vector(j)
                        vtc(count)=posSimAt(1,k);
                        count=count+1;
                    end
                end
            end
            for k=1:length(vtc)
                atMatrix(k,2)=vtc(k);
                atMatrix(k,1)=str2double(rxnFile{begmol(i)+4+vtc(k)}(61:63));
            end
            atMatrix = sortrows(atMatrix);

```

