## Application of G-Inverse in Search of Reactions Feasible to the Metabolism of a Species

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## Metabolism



- Metabolism comprises the entire set of chemical reactions that occur in a living organism
- It allows the organism to reproduce, develop, maintain its structure and respond to the environment

Understanding metabolism: A step towards understanding

## cellular behavior

Analysis of metabolism:

- Construction of a network model and topological analysis
- Set of all reaction would help

Kinetic Modeling<br>Structural Modeling

For different kind of analysis, mass conservation principle should be maintained

All the reactions should be stoichiometrically balanced

## What are the problems with databases?

- Inconsistency in Databases

Duplication of Reactions
Missing reactions
Stoichiometrically incorrect reactions

- Using public Databases, serious challenges remain

Testing accuracy of all reactions manually is impractical

- Error in one Reaction can turn whole model erroneous

This approach can rid off most of the above

## Stoichiometry

- Reaction stoichiometry describes the quantitative relationships among substances as they participate in chemical reactions
- Stoichiometry can be used to calculate quantities such as the amount of products that can be produced with given reactants and percent yield (the percentage of the given reactant that is made into the product)
i.e. if no residues remains then yield is $100 \%$
- Simply it deals with 'conservation of mass' i.e. if in a chemical reaction mass of reactants is not equal to product then it is a 'Stoichiometrilly Incorrect' reaction


## Unbalanced Reactions

E.Coli<br>M.Tuberculosis<br>H.pylori<br>- KEGG<br>4.6\%<br>2.6\%<br>4.1\%<br>- BioCyc<br>0.6\%<br>1.4\%<br>1.5\%

# Stoichimetrically Incorrect Reaction <br> $$
\mathrm{N}_{2}+\mathrm{H}_{2} \rightarrow \mathrm{NH}_{3}
$$ <br> Table of Mass 

Reactant Elements

$$
\begin{aligned}
& \text { N } 2 \\
& \mathrm{H} 2
\end{aligned}
$$

Product Elements
N 1
H 3

This reaction is unbalanced by both $\mathrm{N} \& \mathrm{H}$ After balancing...

$$
\mathrm{N}_{2}+3 \mathrm{H}_{2}=2 \mathrm{NH}_{3}
$$

Now stoichiometry describe exactly one molecule of nitrogen ( $\mathrm{N}_{2}$ ) reacts with three molecules of hydrogen $\left(\mathrm{H}_{2}\right)$ to produce two molecules of ammonia

## Balancing Chemical Reactions

$$
\mathrm{Al}+\mathrm{O}_{2}->\mathrm{Al}_{2} \mathrm{O}_{3}
$$

We can balance this equation easily
$1^{\text {st }}$ try to make mass of each molecule in either side equal

$$
2 \mathrm{Al}+1.5 \mathrm{O}_{2}->\mathrm{Al}_{2} \mathrm{O}_{3}
$$

This fraction part is horrible thing
Now multiplying each side by 2 we get

$$
4 \mathrm{Al}+3 \mathrm{O}_{2}=2 \mathrm{Al}_{2} \mathrm{O}_{3}
$$

If the equation is like this

$$
\mathrm{C}_{14} \mathrm{H}_{14} \mathrm{O}_{4}+\mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+\mathrm{O}_{2}-->\mathrm{C}_{11} \mathrm{H}_{6} \mathrm{O}_{3}+\mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+\mathrm{C}_{3} \mathrm{H}_{6} \mathrm{O}+\mathrm{H}_{2} \mathrm{O}
$$

The task is not easy....

## Let us take an example from Database Reaction No. "RXN-8386"

```
"CPD-8191" + "NADPH" + "OXYGEN-MOLECULE" -> "PHYTOALEXIN-CMPD" + "NADP" + "ACETONE" +"WATER"
```

$\mathrm{C}_{14} \mathrm{H}_{14} \mathrm{O}_{4}+\mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+\mathrm{O}_{2}->\mathrm{C}_{11} \mathrm{H}_{6} \mathrm{O}_{3}+\mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+\mathrm{C}_{3} \mathrm{H}_{6} \mathrm{O}+\mathrm{H}_{2} \mathrm{O}$

Table of Mass

Reactant Elements
C 35
H 44
O 23
N 7
P 3

## Product Elements

C 35
H 43
O 22
N 7
P 3

This reaction is unbalanced by $\mathrm{H} \& \mathrm{O}$

## How to Solve?

To solve the problem concept of G-inverse and its properties are used What is G-inverse?
For a mxn matrix $A$, its $G$-inverse is an nxm matrix $X$ satisfying certain Properties

$$
\begin{gathered}
\text { A XA }=\mathrm{A} \\
\text { XA X }=\mathrm{X} \\
(\mathrm{~A} \mathrm{X})^{\mathrm{T}}=\mathrm{A} \mathrm{X} \\
(\mathrm{XA})^{\mathrm{T}}=\mathrm{XA}
\end{gathered}
$$

All properties are satisfied with Moore-Penrose Inverse
Solving with Generalized Inverse:
The purpose of constructing a generalized inverse is to obtain a matrix that can serve as the inverse in some sense for a wider class of matrices

Why Generalized Inverse used here?

- Usual inverse matrix is defined only for non-singular square matrix
- Most Reaction matrices constructed from chemical equations are non square \& they may be a singular one


## Feasibility of Reaction

Let a reaction Matrix $\mathrm{A}_{\mathrm{mn}}$
Calculate the Rank of $\mathrm{A}_{\mathrm{mn}}$
Rank equal to Column , the reaction is infeasible Rank equal to Column-1, reaction is unique
Rank <=column-2, Multiple reaction can be possible

## Decisions \& Computational steps

Moore-Penrose inverse is calculated as $\mathrm{X}_{\mathrm{nm}}$ using iterative method Solution matrix is $S_{n n}=I_{n n}-X_{n m} A_{m n}$
Columns elements of $\mathrm{S}_{\mathrm{nn}}$ holds the fractions of the coefficients
With suitable multiplier we can find the actual coefficients

Computational approach from the beginning
Now the task becomes Easy

## Examples from Database

## Unique Solution

Reaction No."RXN-7712"
2-KETOGLUTARATE + CARBON-DIOXIDE" + NAD(P)H -> threo-d(s)-iso-citrate+ NAD(P)
$\mathrm{C}_{5} \mathrm{H}_{6} \mathrm{O}_{5}+\mathrm{CO}_{2}+\mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} \rightarrow \mathrm{C}_{6} \mathrm{H}_{8} \mathrm{O}_{7}+\mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}$

Table of Mass

Reactant Elements
C 27
H 36
O 24
N 7
P3
Product Elements
C 27
H 37
O 24
N 7
P 3

This reaction is unbalanced by H

## Examples from Database

## Reaction Matrix:

| $\mathrm{C}_{5} \mathrm{H}_{6} \mathrm{O}_{5}$ | $\mathrm{CO}_{2}$ |
| ---: | :--- |
| A | $=\left[\begin{array}{ccccc}51 & \mathrm{C}_{21} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} & \mathrm{C}_{6} \mathrm{H}_{8} \mathrm{O}_{7} & \mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} \\ 6 & 1 & 21 & -6 & -21 \\ 5 & 0 & 30 & -8 & -29 \\ 0 & 2 & 17 & -7 & -17 \\ 0 & 0 & 7 & 0 & -7 \\ \mathrm{C} \\ 0 & 3 & 0 & -3\end{array}\right]$H <br> O <br> N |

Rank of the reaction matrix is $4=$ column- 1 , so the reaction is unique

$$
\mathrm{C}_{5} \mathrm{H}_{6} \mathrm{O}_{5}+\mathrm{CO}_{2}+2 \mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}=\mathrm{C}_{6} \mathrm{H}_{8} \mathrm{O}_{7}+2 \mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}
$$

## Examples from Database

## With multiple solutions

Reaction No. "RXN-8386"
$\mathrm{C}_{14} \mathrm{H}_{14} \mathrm{O}_{4}+\mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+\mathrm{O}_{2}-->\mathrm{C}_{11} \mathrm{H}_{6} \mathrm{O}_{3}+\mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+\mathrm{C}_{3} \mathrm{H}_{6} \mathrm{O}+\mathrm{H}_{2} \mathrm{O}$ Table of Mass:
The reaction matrix is:
$A=\left[\begin{array}{ccccccc}\mathrm{C}_{14} \mathrm{H}_{14} \mathrm{O}_{4} & \mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} & \mathrm{O}_{2} & \mathrm{C}_{11} \mathrm{H}_{6} \mathrm{O}_{3} & \mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} & \mathrm{C}_{3} \mathrm{H}_{6} \mathrm{O} & \mathrm{H}_{2} \mathrm{O} \\ 14 & 21 & 0 & -11 & -21 & -3 & 0 \\ 14 & 30 & 0 & -6 & -29 & -6 & -2 \\ 4 & 17 & 2 & -3 & -17 & -1 & -1 \\ 0 & 7 & 0 & 0 & -7 & 0 & 0 \\ 0 & 3 & 0 & 0 & -3 & 0 & 0\end{array}\right] \mathrm{C}$

Rank of the matrix is 4 so multiple solutions are possible $962 \mathrm{C}_{14} \mathrm{H}_{14} \mathrm{O}_{4}+1112 \mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+1188 \mathrm{O}_{2}=1079 \mathrm{C}_{11} \mathrm{H}_{6} \mathrm{O}_{3}+1112 \mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+533 \mathrm{C}_{3} \mathrm{H}_{6} \mathrm{O}+2454 \mathrm{H}_{2} \mathrm{O}$ \&

$$
40 \mathrm{C}_{14} \mathrm{H}_{14} \mathrm{O}_{4}+32 \mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+17 \mathrm{O}_{2}=37 \mathrm{C}_{11} \mathrm{H}_{6} \mathrm{O}_{3}+32 \mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+51 \mathrm{C}_{3} \mathrm{H}_{6} \mathrm{O}+32 \mathrm{H}_{2} \mathrm{O}
$$

## Examples from Database

## Guessing the solution of infeasible reaction

Reaction No.:"1.17.1.2-RXN"
"|delta(3)-isopentenyl-pp|" + "|NAD(P)|" + "WATER" -> "E-4-HYDROXY-3-METHYLBUT-2-EN-1-YL-DIPH" + "|NAD(P)H|"

$$
\begin{gathered}
\mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{7} \mathrm{P}_{2}+\mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} \rightarrow \mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{8} \mathrm{P}_{2}+\mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} \\
\text { Table of Mass }
\end{gathered}
$$

Reactant Element
C 26
H 41
O 24
P 5
N 7

Product Elements
C 26
H 42
O 25
P 5
N 7

This Reaction is unbalanced by H and O

$$
\begin{aligned}
& \text { Examples from Database } \\
& \mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{7} \mathrm{P}_{2}+\mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} \rightarrow \mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{8} \mathrm{P}_{2}+\mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}
\end{aligned}
$$

Reaction Matrix:

$$
\begin{aligned}
& \mathrm{A}=\left[\begin{array}{cccc}
\mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{7} \mathrm{P}_{2} & \mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} & \mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{8} \mathrm{P}_{2} & \mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3} \\
12 & 21 & -5 & -21 \\
7 & 29 & -12 & -30 \\
2 & 17 & -8 & -17 \\
0 & 3 & -2 & -3 \\
0 & 7 & 0 & -7
\end{array}\right]
\end{aligned}
$$

Rank of its reaction matrix is equal to its column so the reaction is not feasible with present set of reactants and products

## Examples from Database

Adding "WATER" we can balance it $\mathrm{H}_{2} \mathrm{O}+\mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{7} \mathrm{P}_{2}+2 \mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}=\mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{8} \mathrm{P}_{2}+2 \mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}$

This reaction is unique as now the rank of its reaction matrix is column-1

The same reaction shown in previous slide can be balanced by adding "OXYGEN" and "PROTON"
$\mathrm{O}_{2}+\mathrm{H}+2 \mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{7} \mathrm{P}_{2}+\mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}=2 \mathrm{C}_{5} \mathrm{H}_{12} \mathrm{O}_{8} \mathrm{P}_{2}+\mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}$

Feasible reactions can be verified experimentally

## Examples from Database

## Another example

## "RXN66-316":

CPD-4579+NAD(P)H+OXYGEN-MOLECULE -> CPD-4580+NAD(P)+2WATER $\mathrm{C}_{28} \mathrm{H}_{46} \mathrm{O}_{2}+\mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+\mathrm{O}_{2} \rightarrow \mathrm{C}_{28} \mathrm{H}_{44} \mathrm{O}_{2}+\mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+2 \mathrm{H}_{2} \mathrm{O}$

Table of Mass

Reactant Elements
C 49
H 76
O 21
N 7
P3

Product Elements
C 49
H 77
O 21
N 7
P3

This reaction is still unbalanced by H We found if the coefficient of water is 2
Then the balanced equation should be $\mathrm{C}_{28} \mathrm{H}_{46} \mathrm{O}_{2}+2 \mathrm{C}_{21} \mathrm{H}_{30} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+\mathrm{O}_{2}=\mathrm{C}_{28} \mathrm{H}_{44} \mathrm{O}_{2}+2 \mathrm{C}_{21} \mathrm{H}_{29} \mathrm{~N}_{7} \mathrm{O}_{17} \mathrm{P}_{3}+2 \mathrm{H}_{2} \mathrm{O}$

## Implications

- 千dentify the reaction where mass is conserved or not
- Identify the reaction which cannot be balance with present set of reactants \& products
-Experimentalist can look on this to identify the missing reactants and/or products
-With the help of known chemical space(known biochemical molecules) one can try to identify the possible missing molecule
- One can also balance the unbalanced reaction(if feasible)
- This method can suggest multiple solution of reactions which satisfy the condition Rank<=Column-2

Ultimately help in correct modeling

# Thank You.. 

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