

# Construction of Genome Scale Models

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Wednesday L7

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Easy to analyse

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## Genome-scale Models

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We don't define the contents.

Undefined (2)

We don't know the contents.

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The tech. won't always scale.

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- Save the reactions in a suitable format
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- Reactions present that should be absent.

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2) Non-specific metabolites e.g. :

- “Some-tRNA”
- “Long-Chain-Fatty-Acids”
- “An alcohol”

## 3) Incorrect stoichiometries e.g.

- "3.2.1.58-RXN": NOTHING  $\rightarrow$  NOTHING
- "3.6.3.4-RXN' : "CU+2" + "WATER" + "ATP"  $\rightarrow$  "CU+2" + "|Pij|" + "ADP"
- "UROPORIIIMETHYLTRANSA-RXN":  
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# The problem with polymers 1

Consider:

● “RXN-1827”:

“1-4-alpha-D-Glucan” + “WATER” → “ALPHA-MALTOSE” + “1-4-alpha-D-Glucan”

● Is the real stoichiometry ?

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# The problem with polymers - a solution

For homopolymers rewrite reaction in terms of monomeric units, e.g. Glc for 1-4-alpha-D-Glucan:

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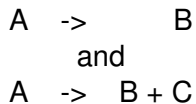
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# Stoichiometric inconsistencies

Clearly:



Cannot both be true.  
(Violation of mass conservation)

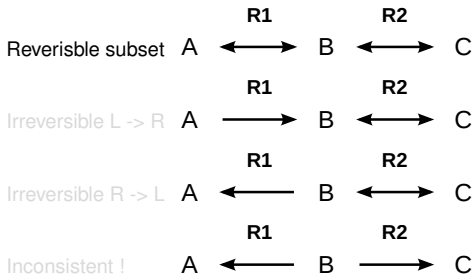
# Stoichiometric inconsistencies

Even without empirical formulae such sets of reactions can be identified by a combination of:

- Analysis of left null-space
- Linear programming
- Provides an automatic method for identification of the polymer problem.
- See: Gevorgyan *et al* 2008, Bioinformatics

# Reaction irreversibility/thermodynamics

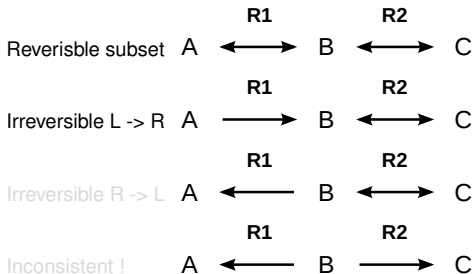
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Identify from null-space in conjunction with a knowledge of reaction (ir)reversibilities.

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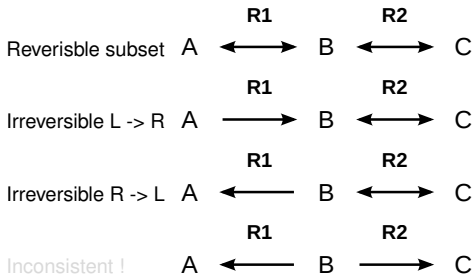
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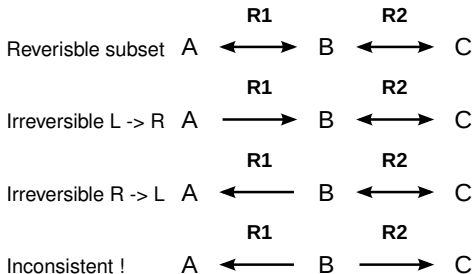


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Violations of conservation of energy:

- Identify from LP:
  - 1 Constrain all transporters to zero flux.
  - 2 Set a demand for ATP and/or NAD(P)H.
  - 3 If the LP has a viable solution an inconsistency exists.
  - 4 All reactions in the solution must now be examined.

# Constructing models - Summary

Constructing GSMs from a database is easy.

Constructing meaningful GSMs from databases is hard.

Requires rigorous and methodical QC

# Technicalities - Modularised models

Components:

- From the DB
- Defined transporters.
- Additional reactions of interest.

ScrumPy provides the `Include()` directive to accomplish this:

```
External ("PROTON" , "WATER")
```

```
Include (AutoGeobac . spy ,  
        Transporters . spy ,  
        Biomass . spy ,  
        ExtraReacs . spy ,  
        ETC_core . spy  
)
```

# TODO: Technicalities - Naming conventions

Be consistent !

- Only use quoted identifiers for items in the DB
- Use “\_tx” suffix to denote a transporter.
- Name transporters according to what they transport.
- Use \_bm\_tx suffix to denote biomass export.

Be consistent !

- Positive flux *always* denotes gain.
- Negative flux *always* denotes loss.