

# A Metabolic Model of *Acetobacterium woodii* for biotechnological purposes



novo nordisk fonden



OXFORD  
**BROOKES**  
UNIVERSITY

Noah Mesfin

Oxford Brookes University,  
Oxford, UK

# Aims

## Project aims

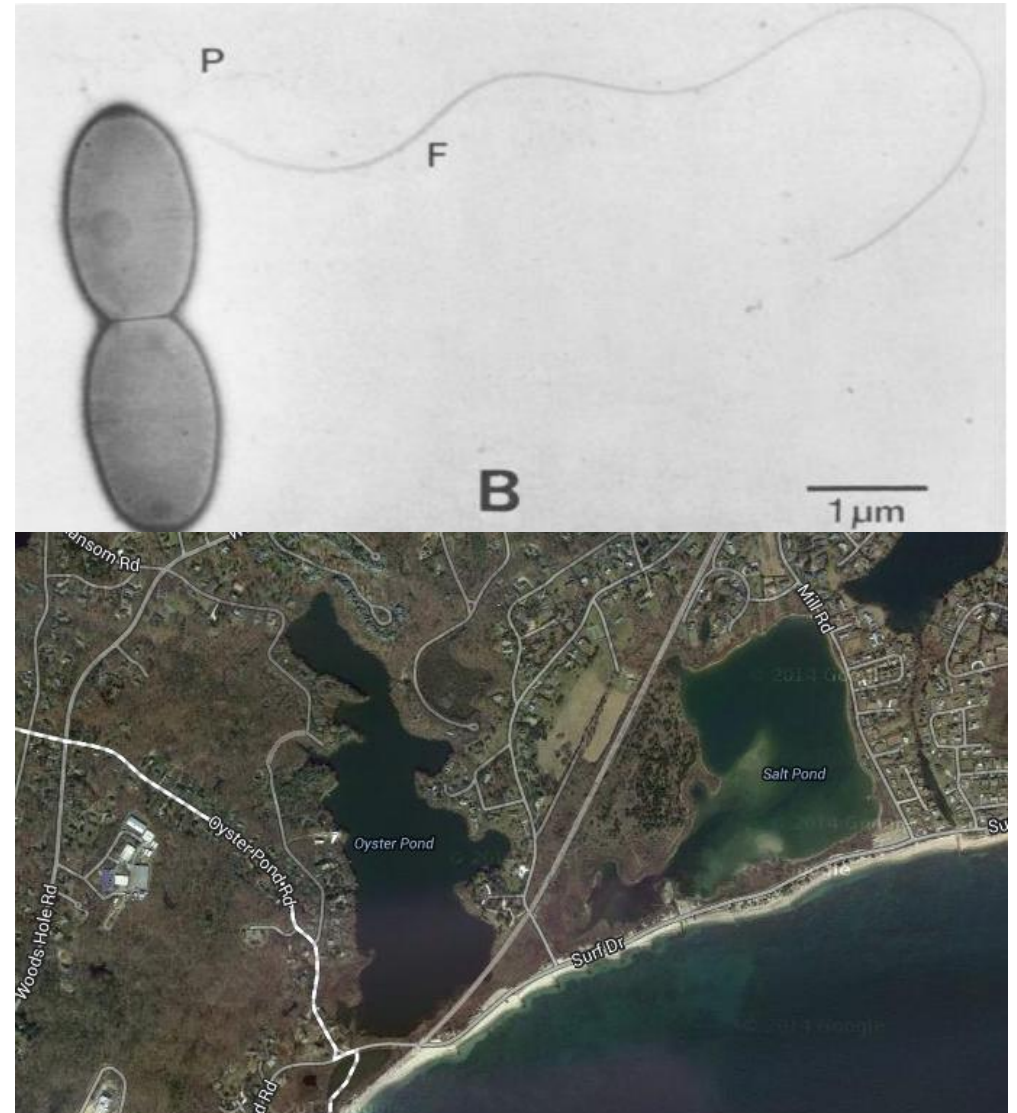
- Gain insights into *A.woodii* metabolism using metabolic modelling.
- *In silico* strain engineering to contribute to the effort in producing an industrially relevant *A.woodii*.

## Current study aims

- Survey the feasibility of producing “platform chemicals” with *A.woodii*
- Use model guided results to plan wet lab experiments

# *A. woodii* Background

- Belongs to group of bacteria called acetogens, of which it is a model organism.
- All acetogens are able to fix CO<sub>2</sub> with H<sub>2</sub> for growth and energy purposes with the Woods-Ljungdahl Pathway (WLP).
- Much bioenergetic work done on *A. woodii* ; the only acetogen with all bioenergetically relevant reactions in WLP characterised.
- Categorised as a Rnf type Na<sup>+</sup> dependant acetogen (along with *E. limosum*)

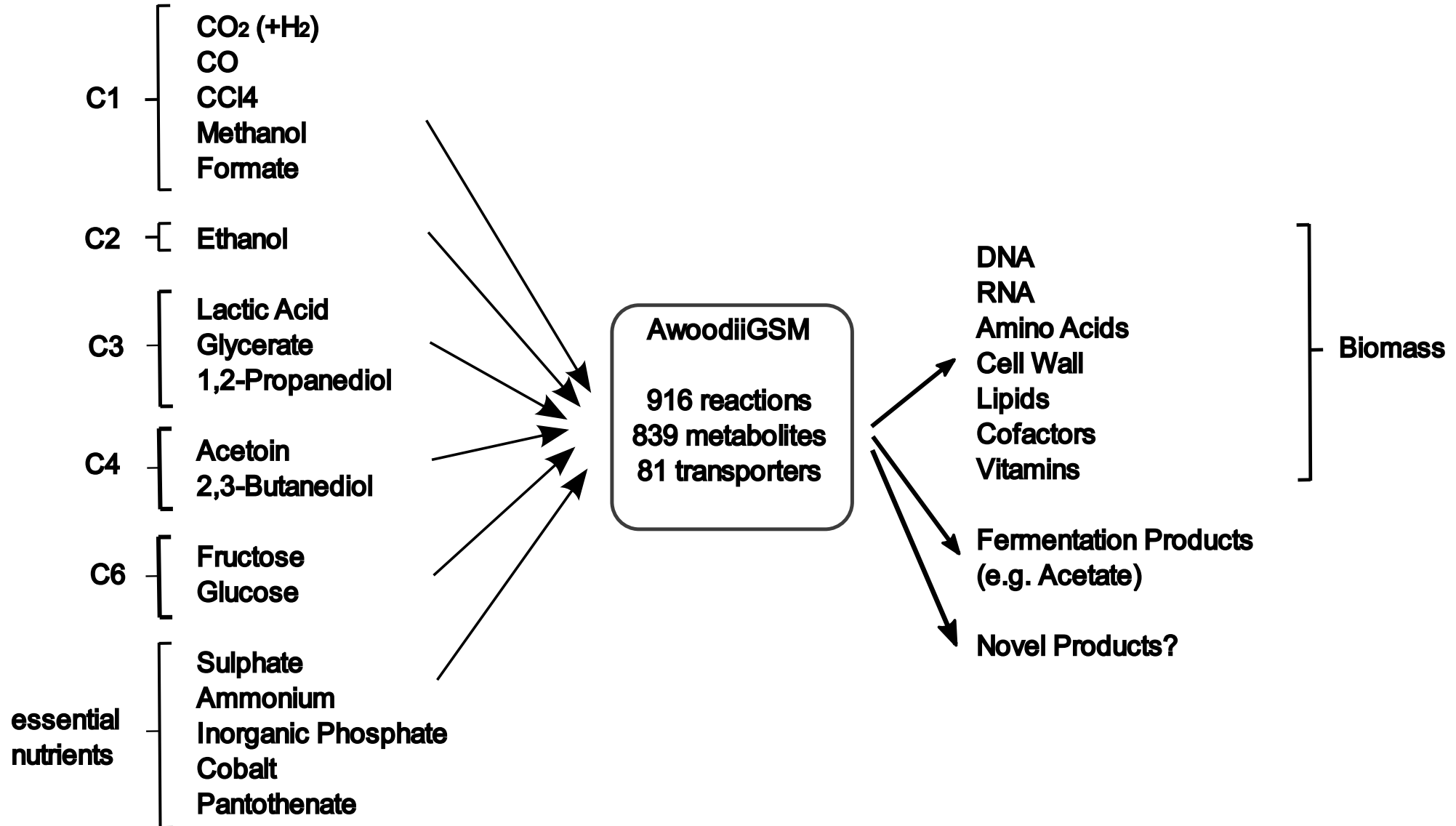


Balch, W. E., et al., 1977

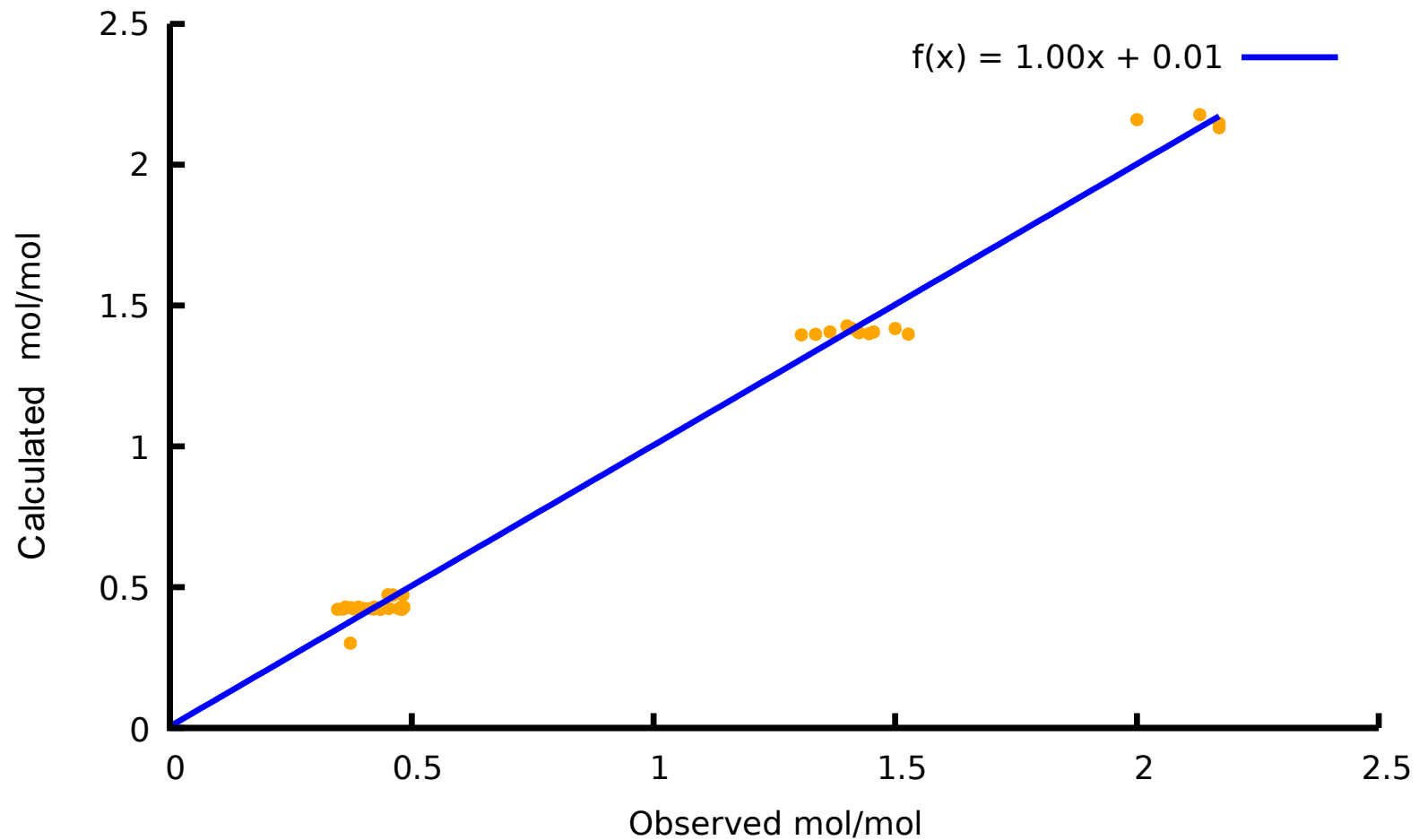
# Modelling Approaches

- Structural modelling. Metabolism at **steady state**; where the **change in concentration** of internal metabolites and the **change in reaction** fluxes is zero.
- **Construction** of a genome-scale metabolic model of *A.woodii* using a recently sequenced genome of strain DSMZ1030.
- Model **validation**
- **Extraction of a sub-model** from the genome-scale model for elementary mode analysis

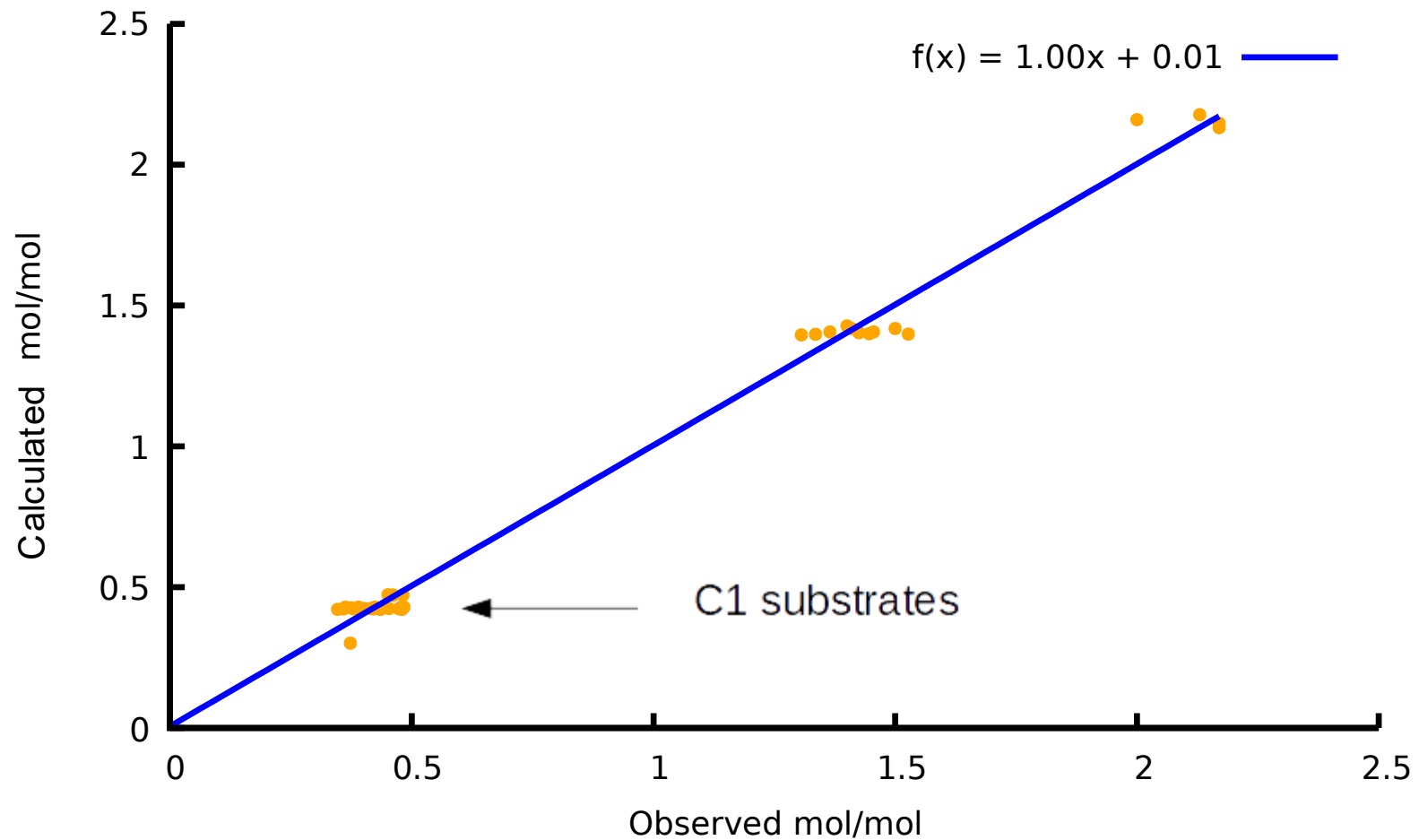
# Genome-scale Model of *A. woodii*



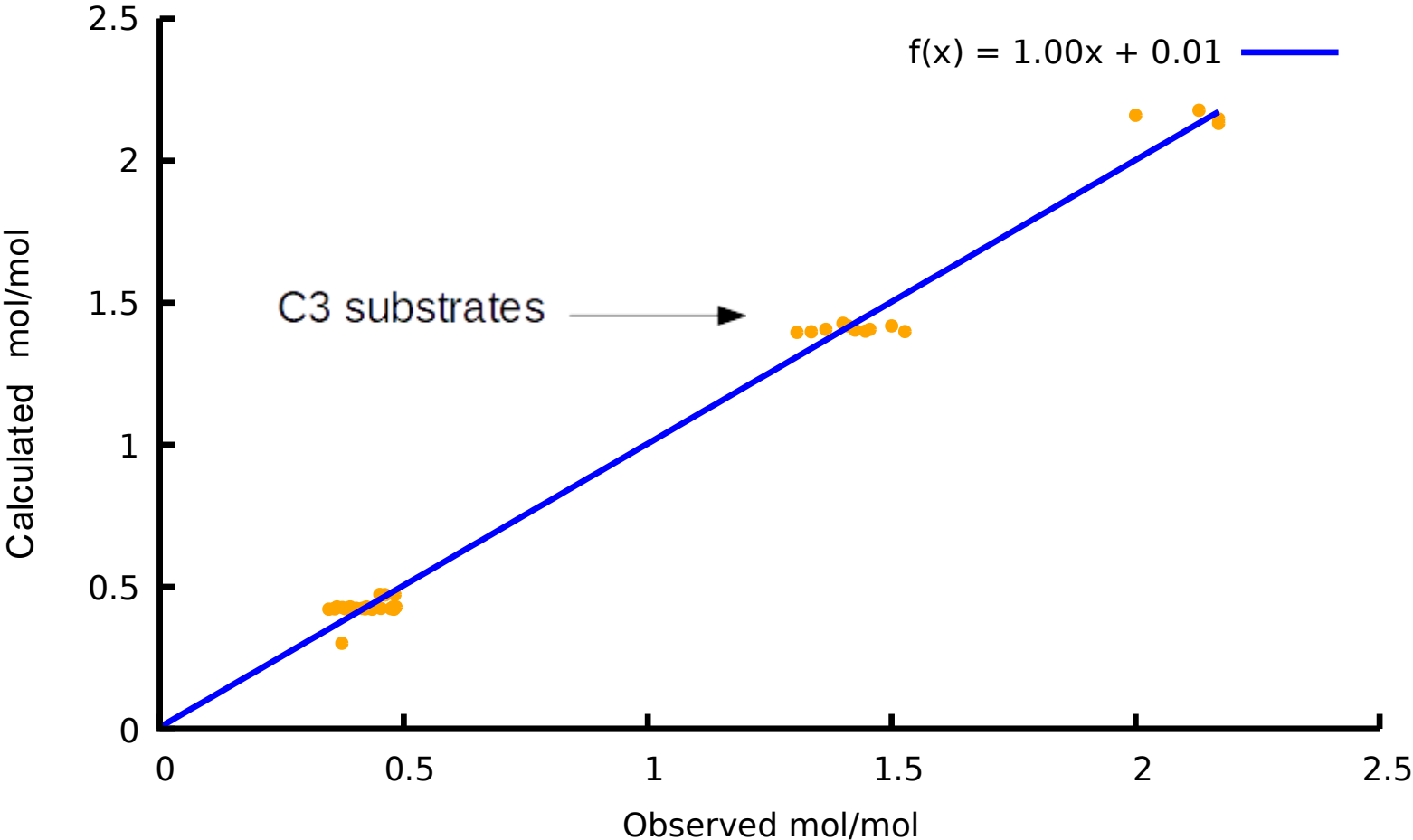
# Model Predicted Acetate Yields vs Observed Acetate Yields



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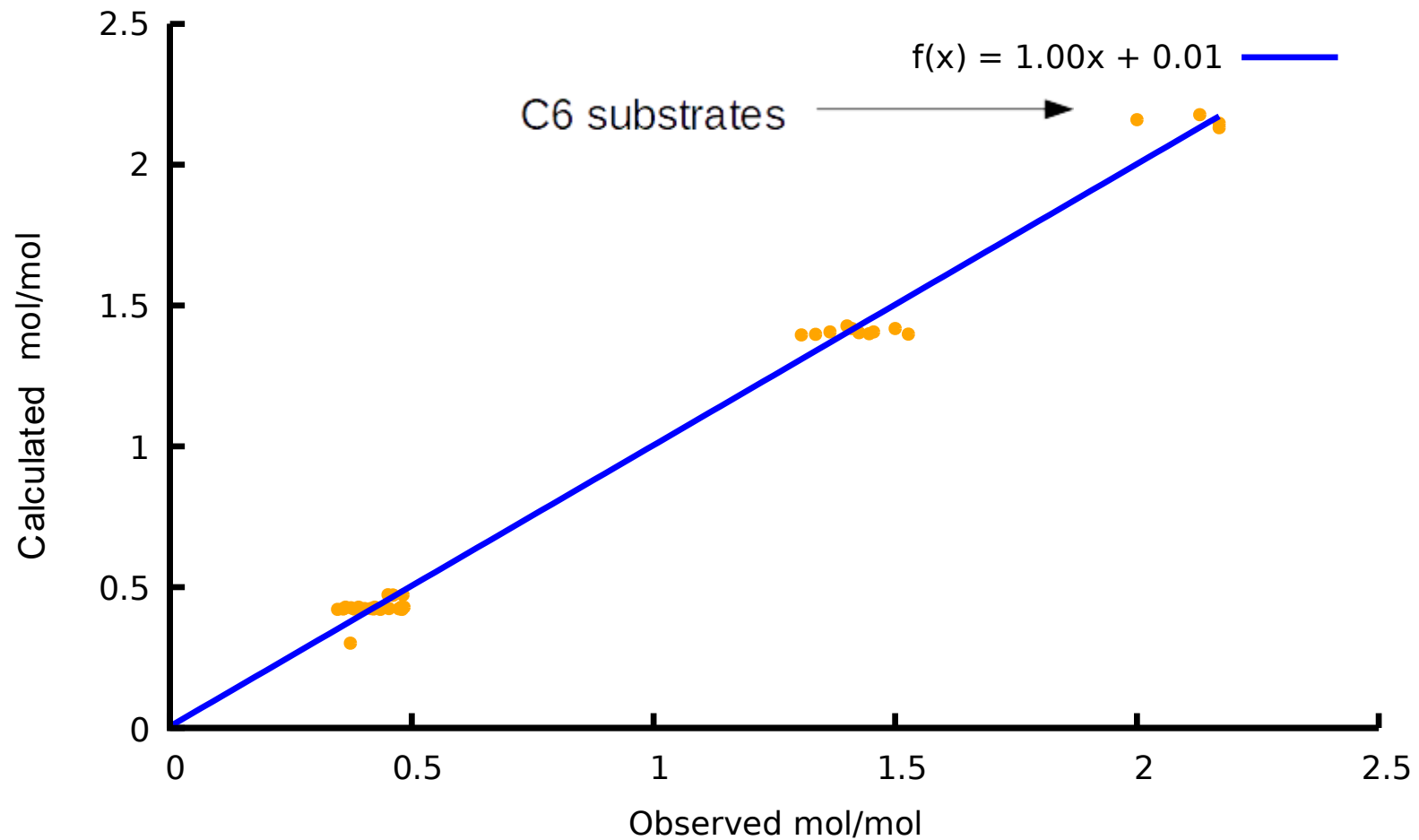


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# Maximum $Y_{ATPs}$ (mol/mol carbon)

| Substrate                        | Product               | Calculated Yield | Estimated Yield* | Reactions |
|----------------------------------|-----------------------|------------------|------------------|-----------|
| Fructose                         | Acetate               | 0.72             | 0.72             | 26        |
| Glycerol                         | Acetate + Ethanol     | 0.55             | -                | 27        |
| 2,3-Butanediol + CO <sub>2</sub> | Acetate               | 0.24             | 0.24             | 22        |
| Ethanol + CO <sub>2</sub>        | Acetate               | 0.18             | 0.18             | 19        |
| Lactate                          | Acetate               | 0.18             | 0.13             | 18        |
| 1,2-Propanediol                  | Propanol + Propionate | 0.17             | 0.17             | 9         |
| H <sub>2</sub> + CO <sub>2</sub> | Acetate               | 0.15             | 0.15             | 17        |
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\*from literature

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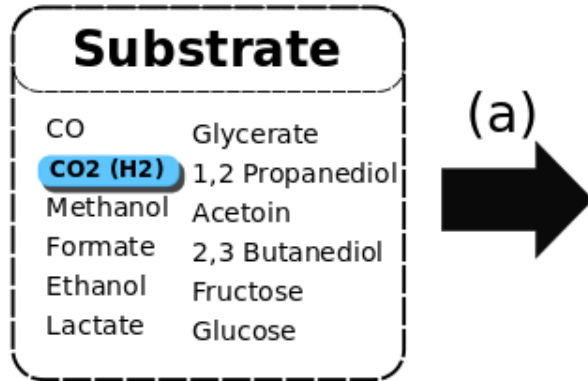
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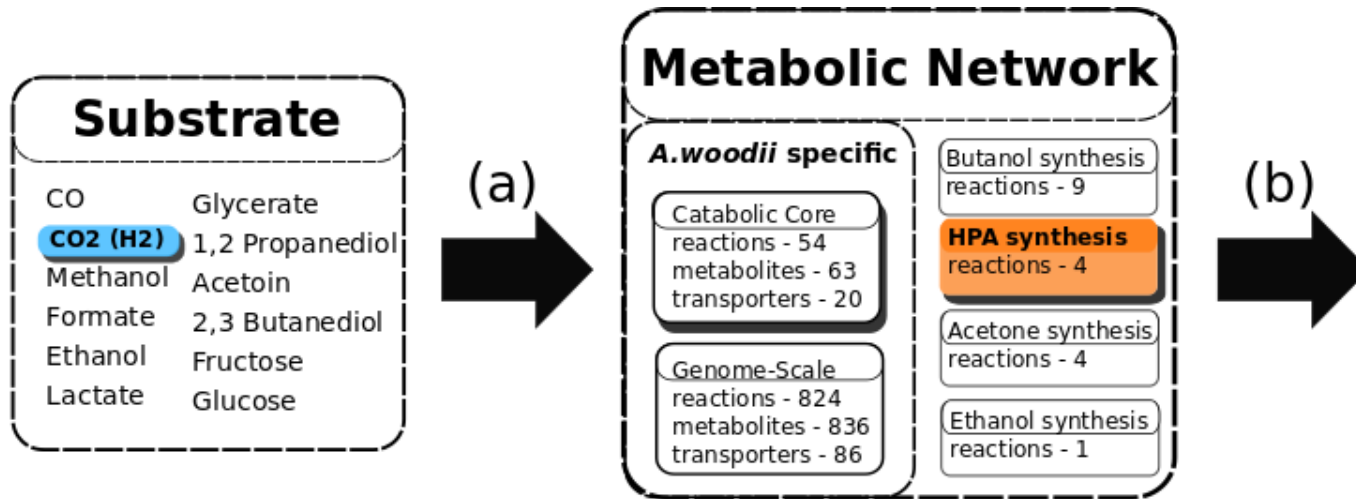
Impact of producing novel compounds on  
*A.woodii* metabolism

# General Workflow



a) Select substrate(s)

# General Workflow

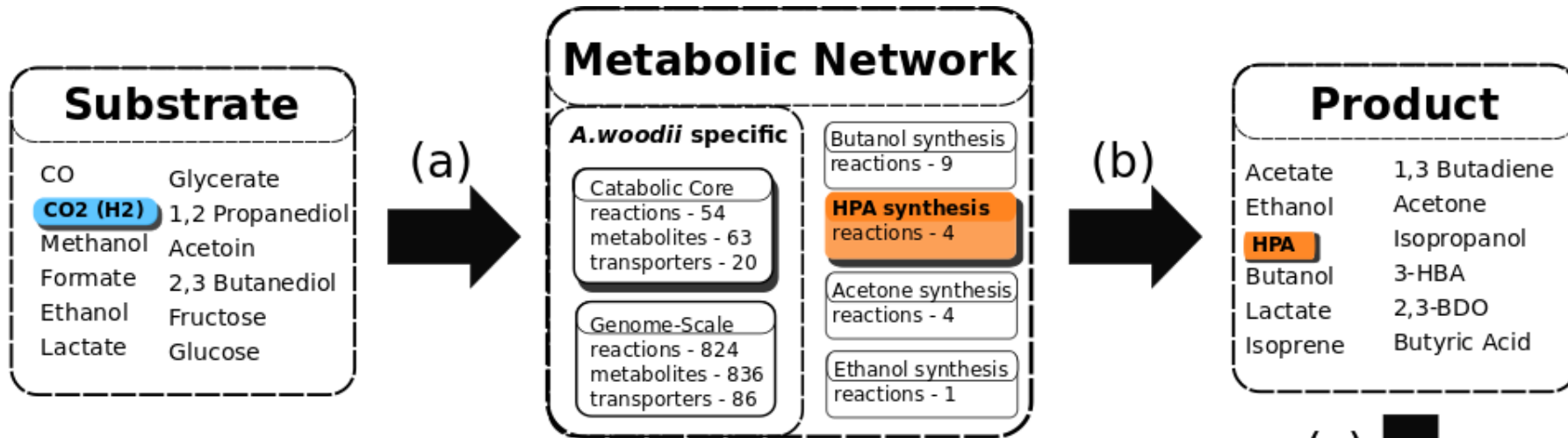


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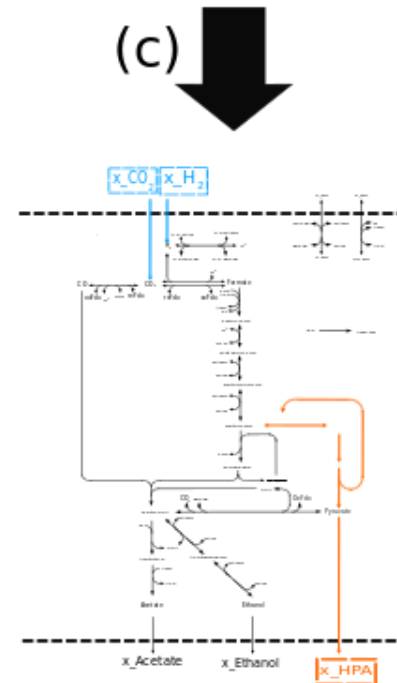
b) Select a metabolic configuration



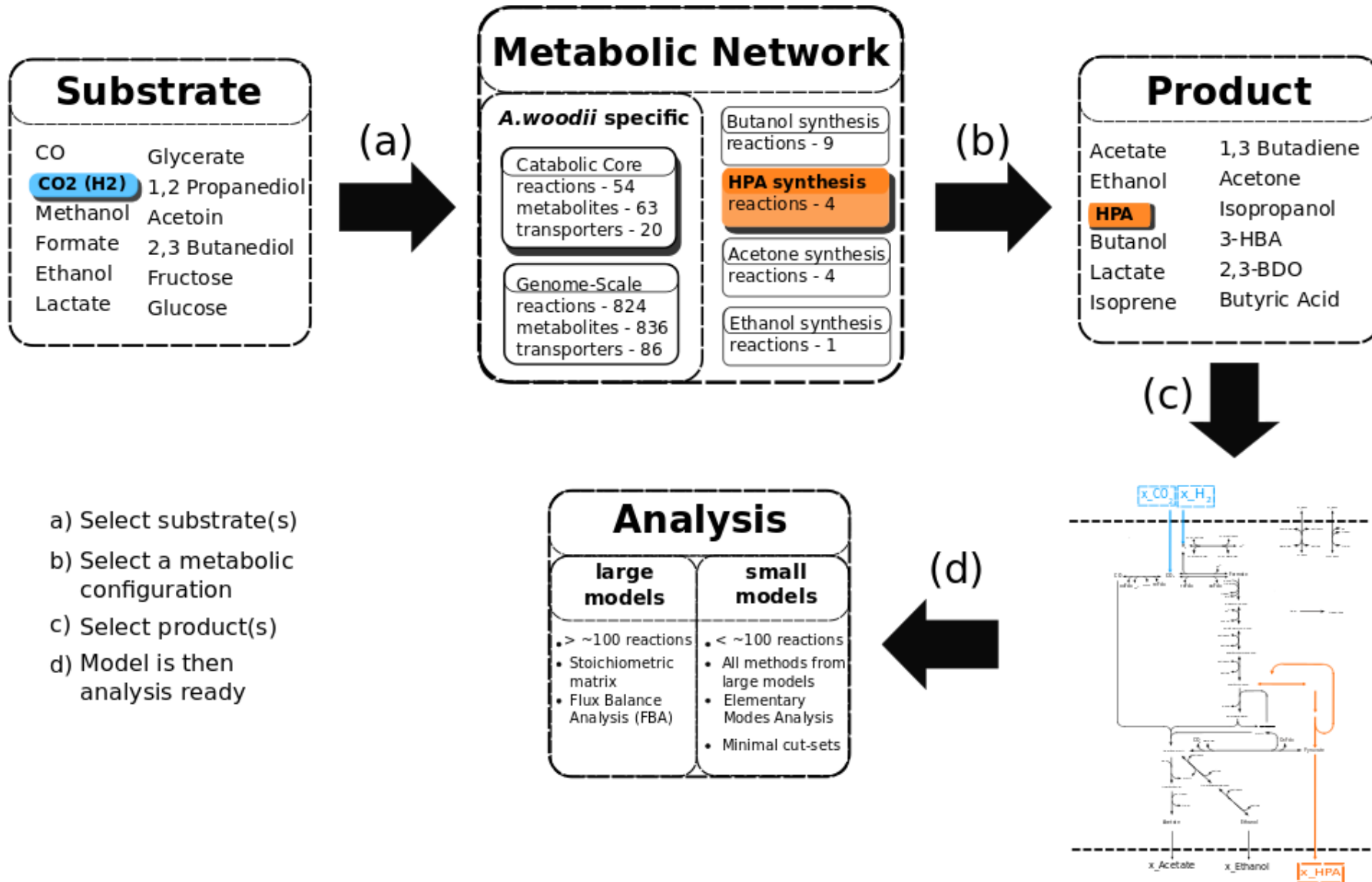
# General Workflow



- a) Select substrate(s)
- b) Select a metabolic configuration
- c) Select product(s)



# General Workflow



- Select substrate(s)
- Select a metabolic configuration
- Select product(s)
- Model is then analysis ready

# Elementary Modes of 3-HPA production

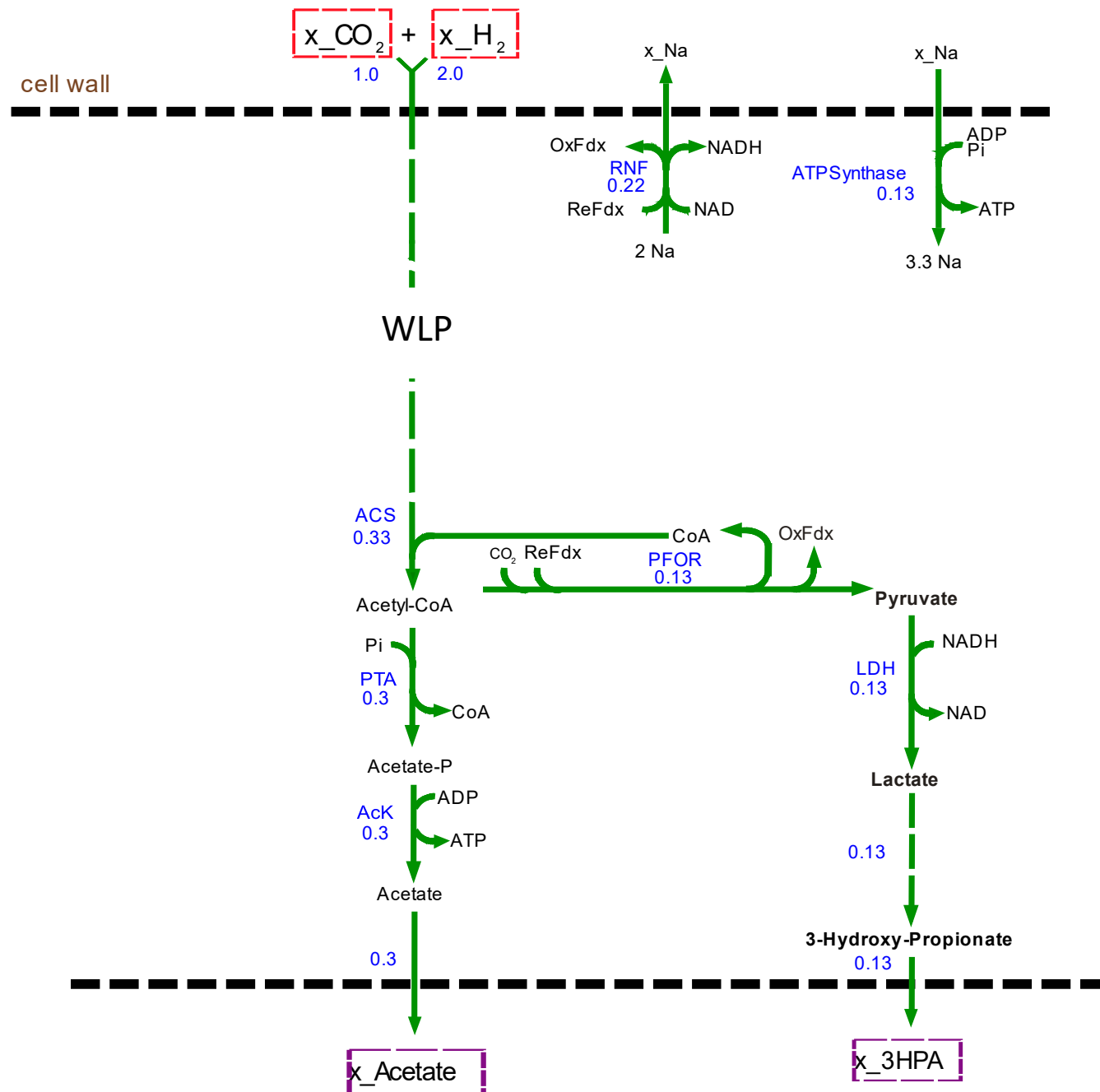
| Elementary Mode | $Y_{\text{HPA}}$<br>(%) | $Y_{\text{ATP}}$<br>(mol/mol carbon) | Number of reactions |
|-----------------|-------------------------|--------------------------------------|---------------------|
| 1               | 100                     | 0.07                                 | 21                  |
| 2               | 100                     | 0                                    | 23                  |
| 3               | 84.8                    | 0                                    | 23                  |
| 4               | 72.7                    | 0                                    | 25                  |
| 5               | 63.6                    | 0                                    | 22                  |
| 6               | 39.4                    | 0                                    | 23                  |

Work done in collaboration with Sheila Ingemann Jensen and Alex Toftgaard Nielsen at Novo Nordisk Foundation Centre for Biosustainability.

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$$Y_{HPA} = 0.13 \quad (39\%)$$

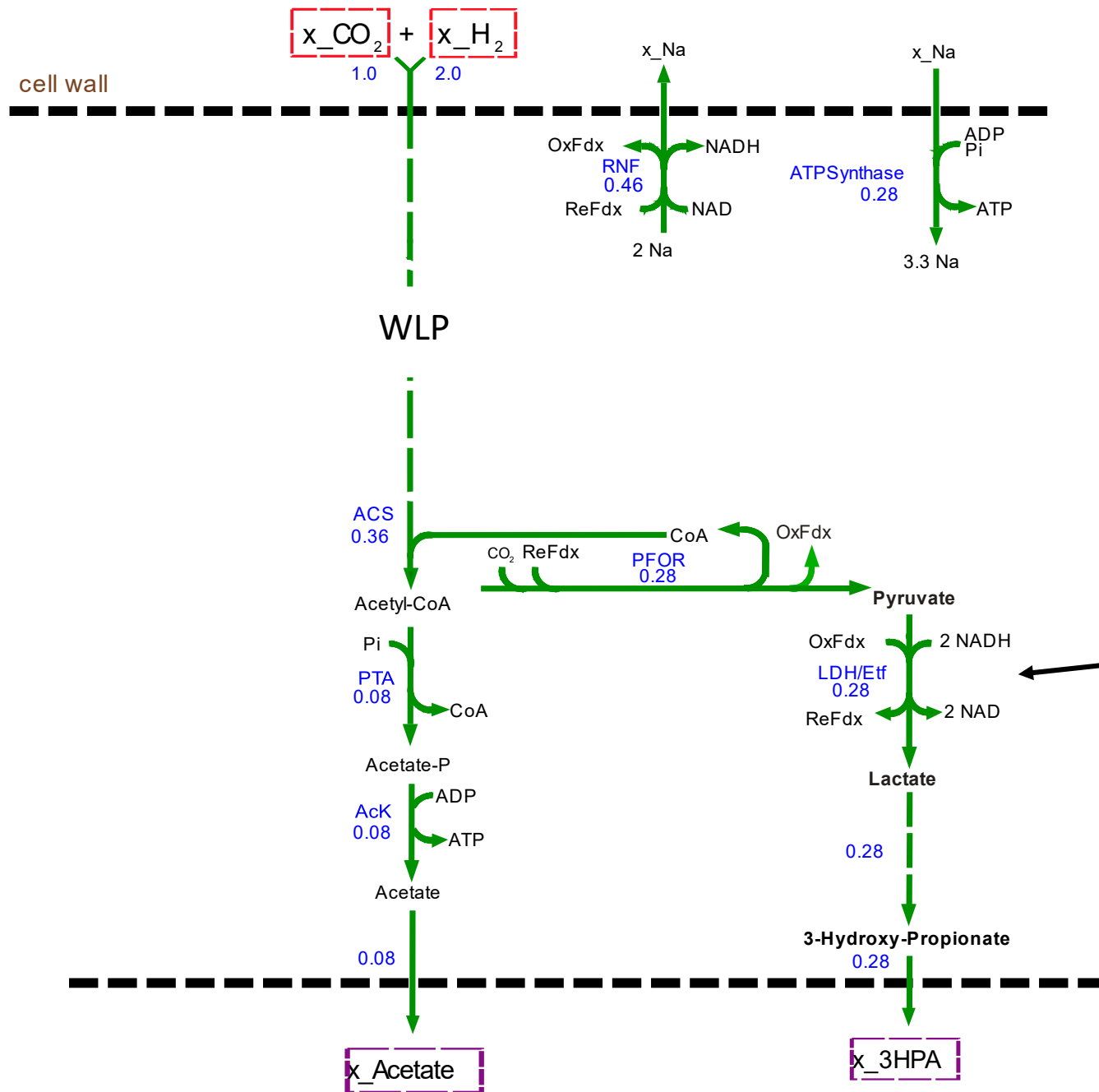
$$Y_{ATP} = 0 \quad (-0.3 \text{ deficit})$$

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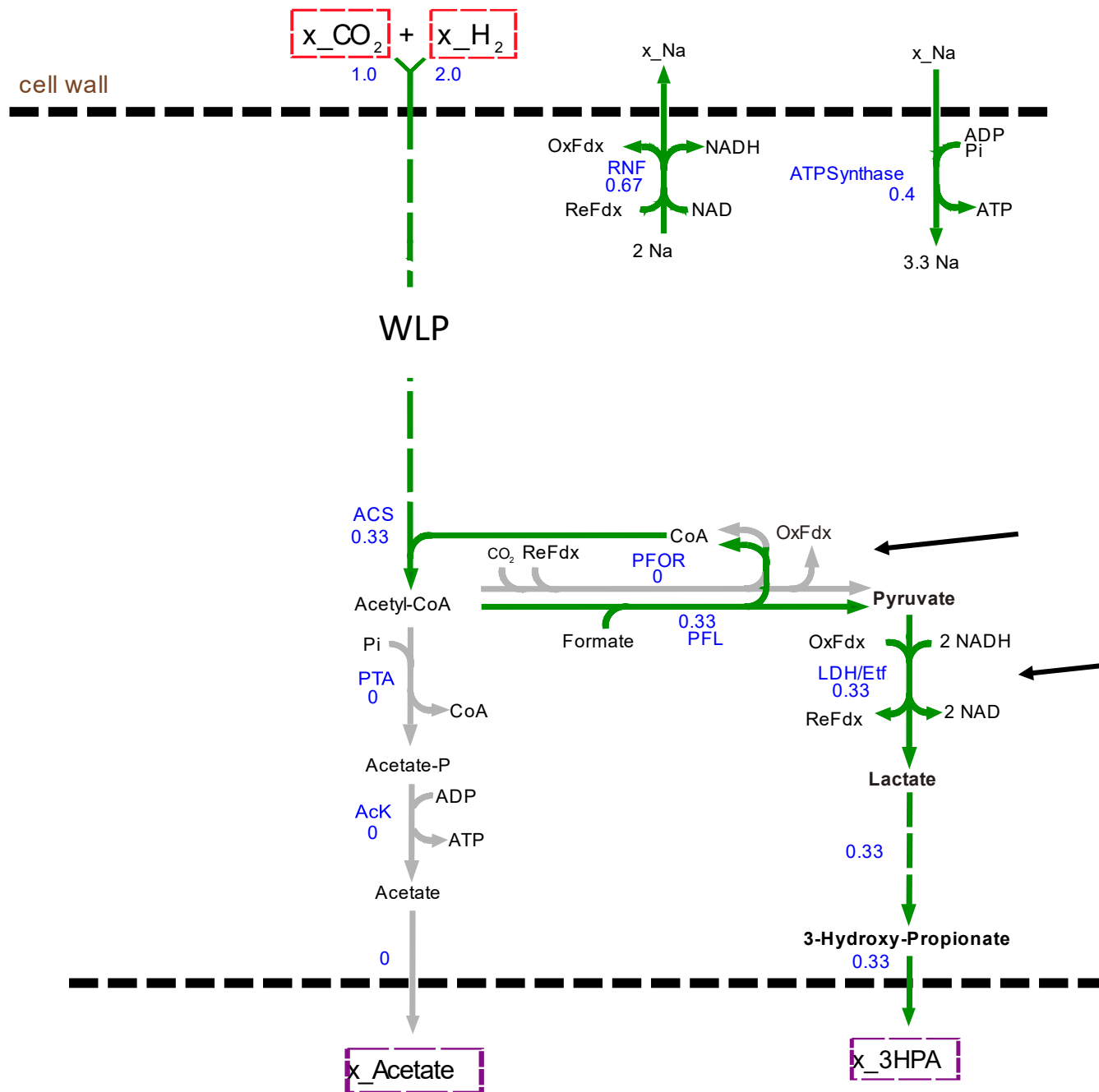


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$$Y_{HPA} = 0.33 \quad (100\%)$$

$$Y_{ATP} = 0.07 \quad (\text{surplus})$$

# Redox Agent Turnover

| <b>Y<sub>HPA</sub></b><br><b>(%)</b> | <b>NADH</b><br><b>(mol/mol carbon)</b> | <b>ReFdx</b><br><b>(mol/mol carbon)</b> |
|--------------------------------------|--|---|
| 100                                  | 1.33                                   | 1                                       |
| 84.8                                 | 1.27                                   | 1.1                                     |
| 39.4                                 | 1                                      | 0.78                                    |

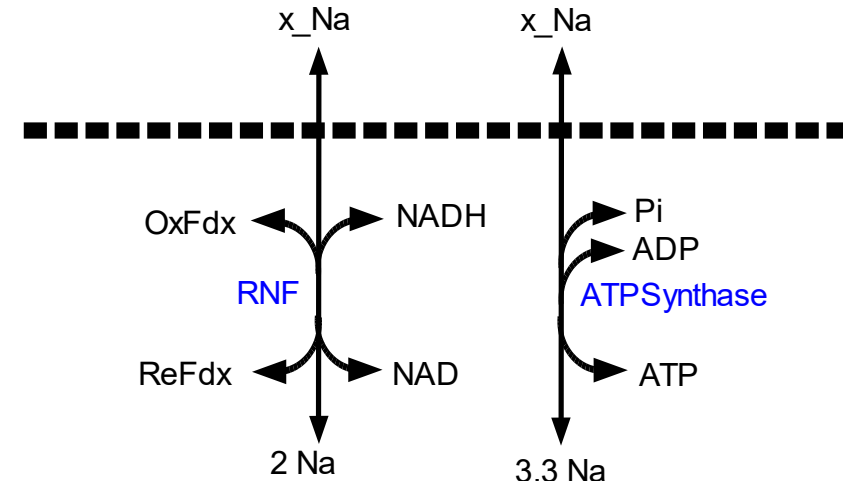
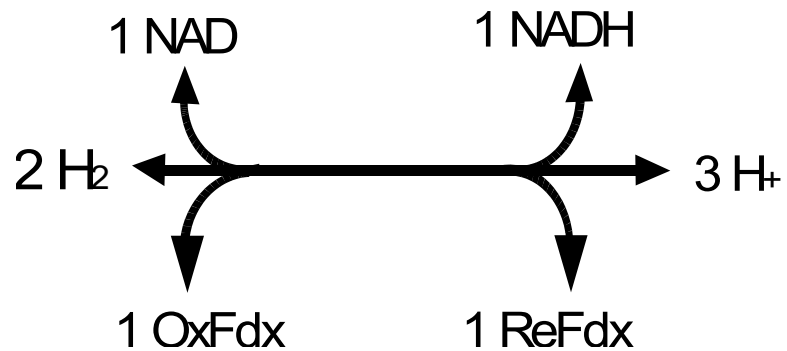
# Redox Agent Turnover

| <b>Y<sub>HPA</sub></b><br>(%) | <b>NADH</b><br>(mol/mol carbon) | <b>ReFdx</b><br>(mol/mol carbon) | <b>RNF</b><br>(flux/mol carbon) |
|-------------------------------|---------------------------------|----------------------------------|---------------------------------|
| 100                           | 1.33                            | 1                                | 0.67                            |
| 84.8                          | 1.27                            | 1.1                              | 0.46                            |
| 39.4                          | 1                               | 0.78                             | 0.22                            |

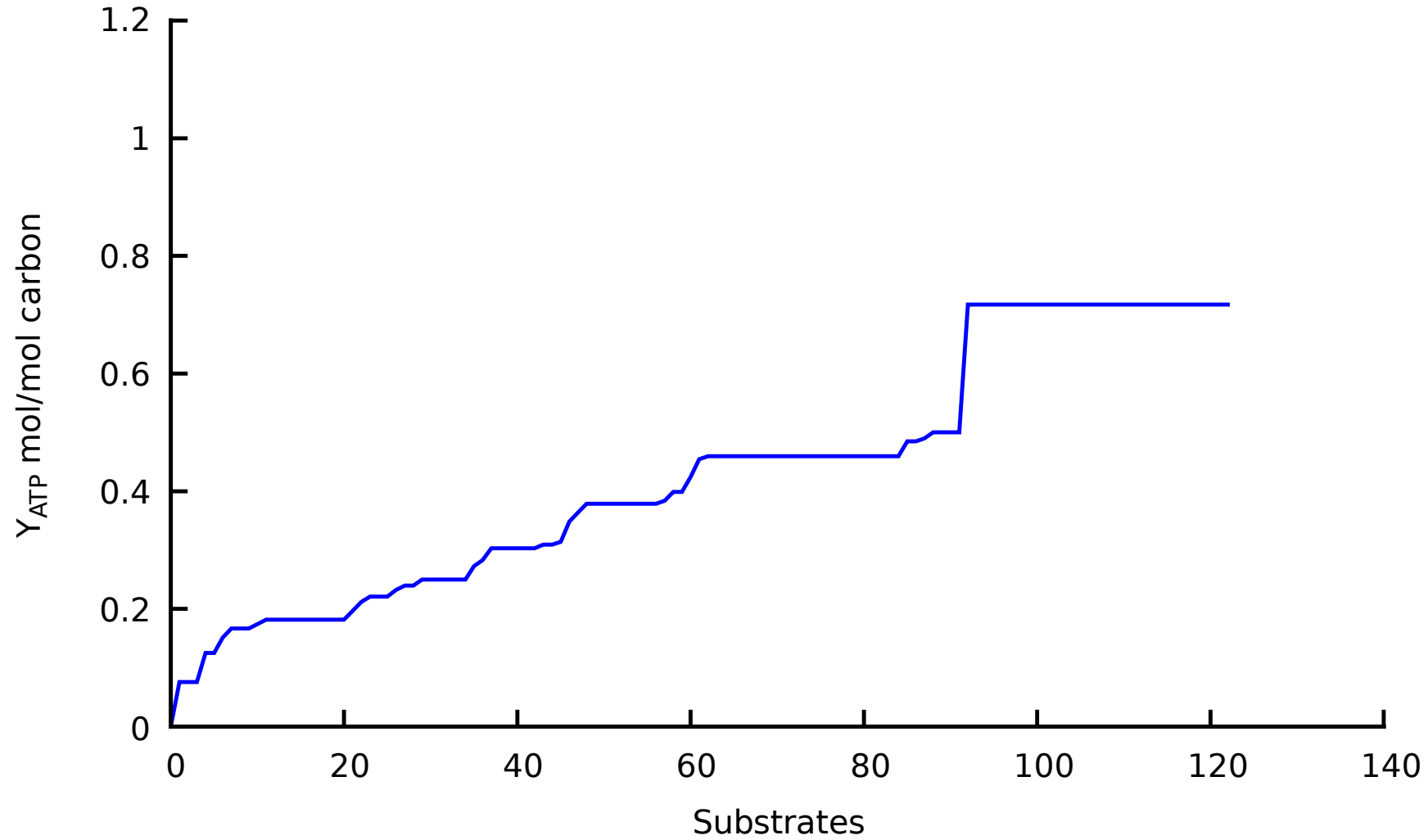
# Net Stoichiometry of *A.woodii* Electron Transport Chain



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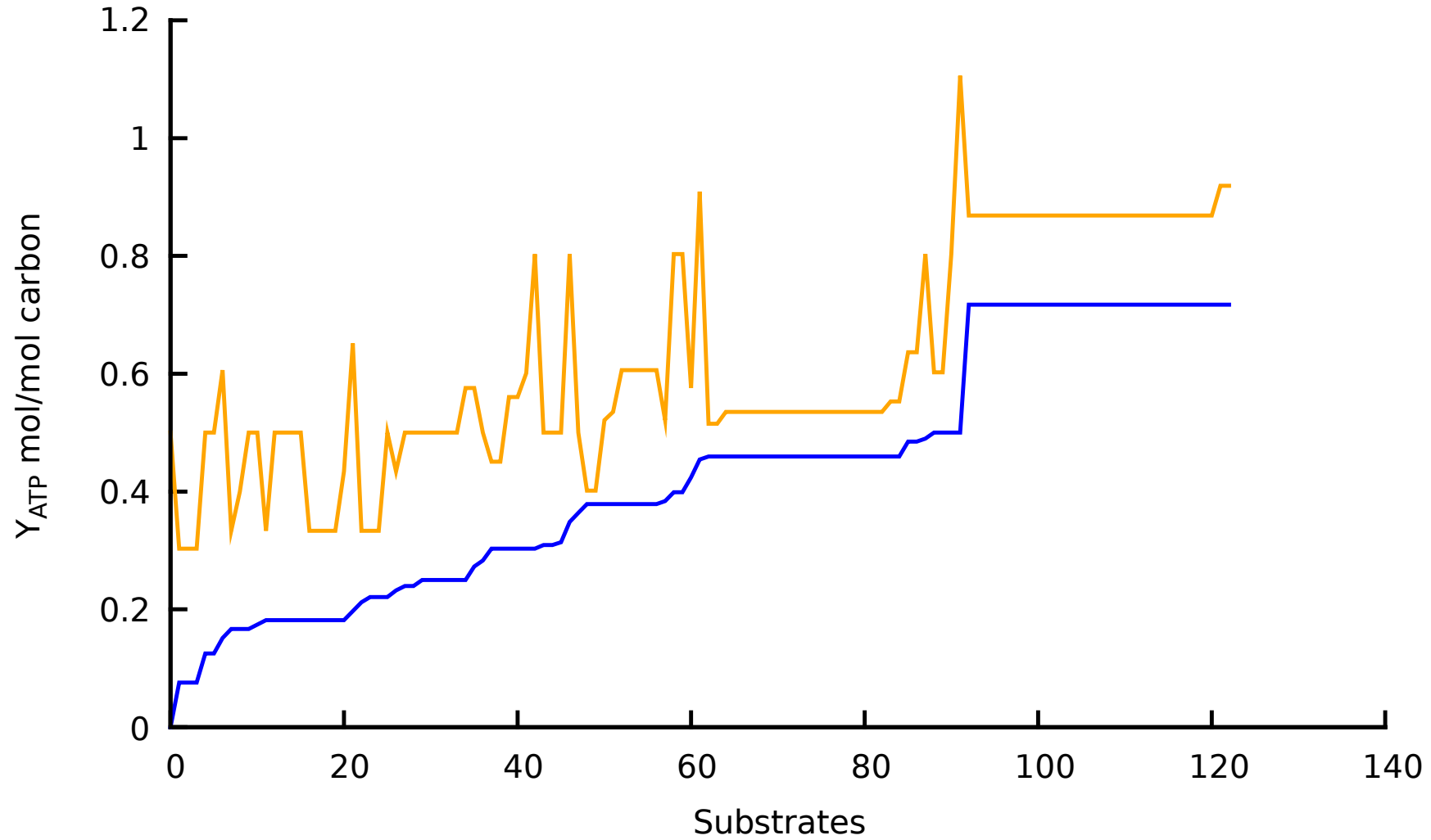


# $Y_{ATP}^{MAX}$ of 124 Substrate Combinations

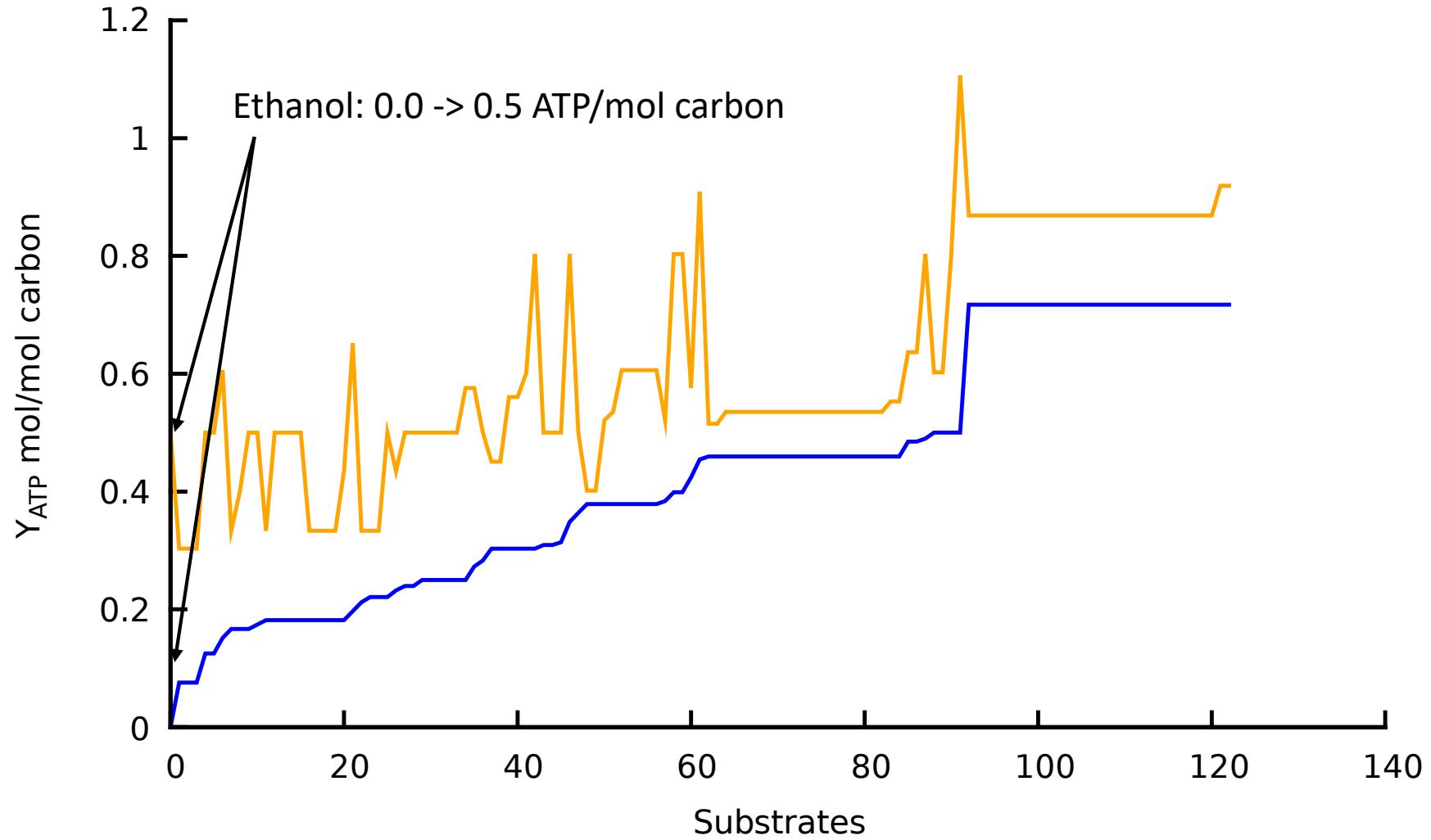




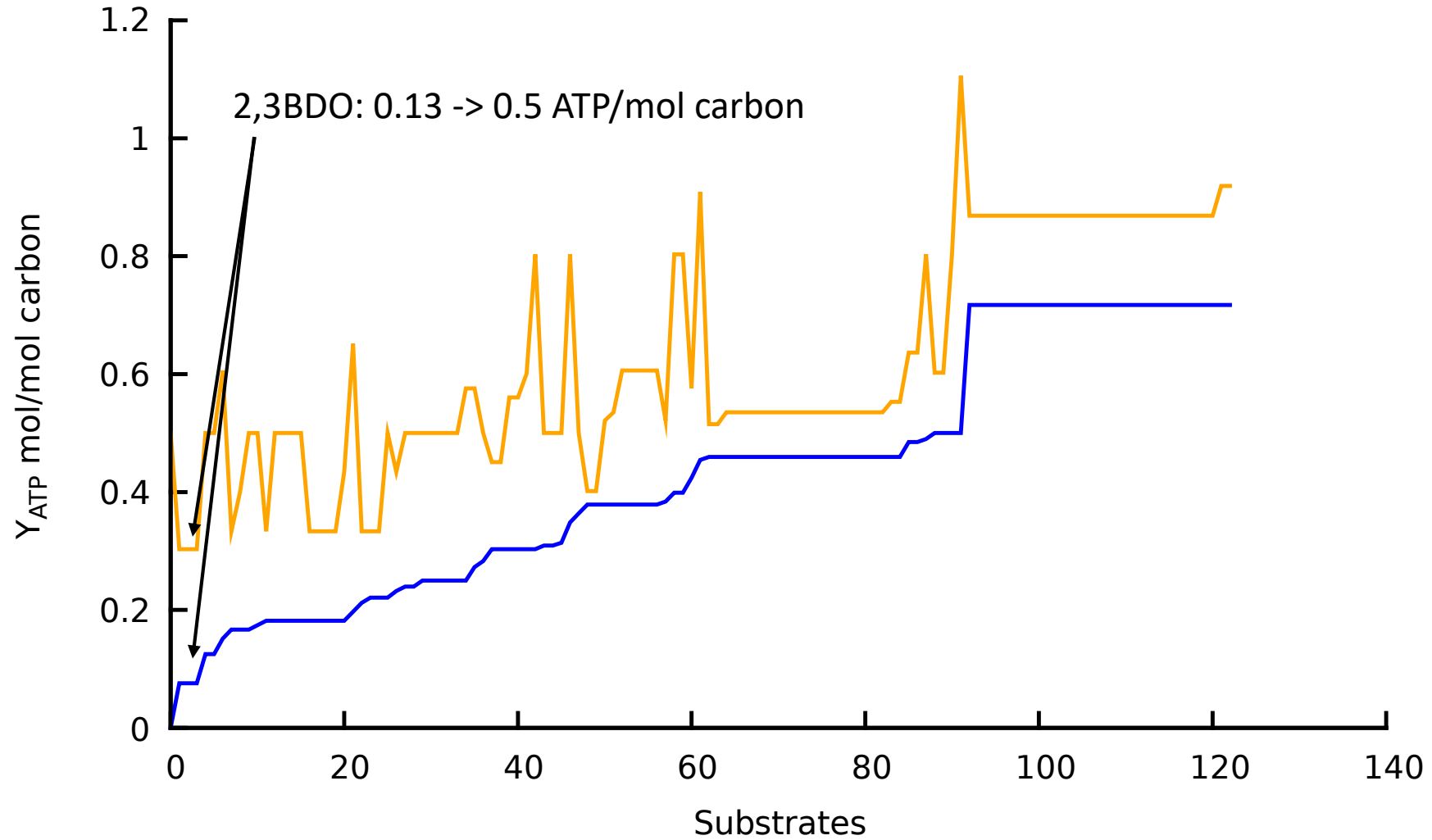
# Hypothetical NADH Sink



# Hypothetical NADH Sink



# Hypothetical NADH Sink



# Alternative Electron Acceptor $Y_{ATP}^{MAX}$

Acetogens are known to reduce a variety of electron acceptors, including several nitrogen sources (e.g. nitrite) and sulphur sources as well as lignin degradation products (e.g. caffeic acid).

| Substrate      | -<br>(no growth) | CO <sub>2</sub> | NADH<br>oxidase | Nitrite |
|----------------|------------------|-----------------|-----------------|---------|
| Ethanol        | 0                | 0.18            | 0.5             | 0.5     |
| 2,3 Butanediol | 0.13             | 0.24            | 0.5             | 0.5     |

Model analysis shows ethanol and 2,3 BDO are not dependent on CO<sub>2</sub> for growth when using alternative electron acceptors. Also, better growth yields are achieved with electron acceptors such as nitrite and caffeic acid (results not shown here).

# Summary

- Metabolic models are a flexible platform for surveying potential target compounds.
- Adding even a few heterologous reactions for HPA production gives rise to several new metabolic regimes, which are identified with elementary modes analysis.
- Insights into the impact of redox balances on bioenergetics is helping guide program of experiments.
- Producing more reduced compounds would be favoured bioenergetically in *A.woodii*.

# Acknowledgments

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Nielsen

# References

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