

# A new simulation: going metabolic

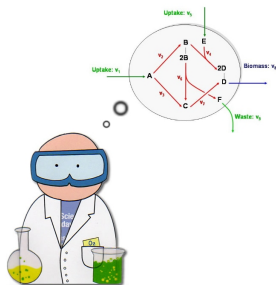
Alexander Ullrich

Institute for Theoretical Chemistry  
University of Vienna

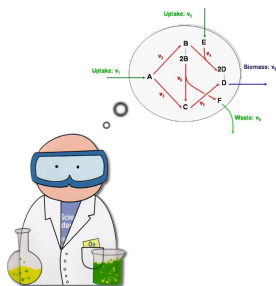
November 3, 2008

# WHY?

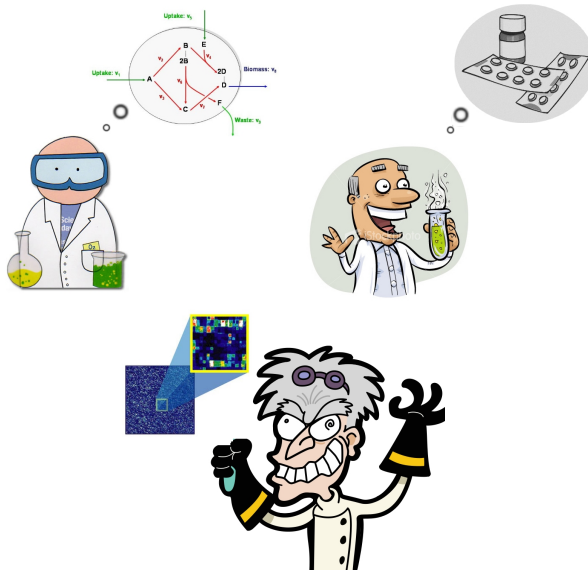
# Why go metabolic?



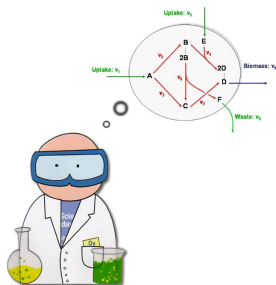
# Why go metabolic?



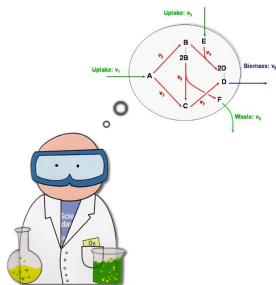
# Why go metabolic?



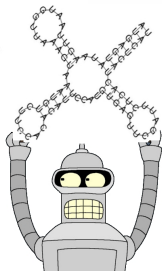
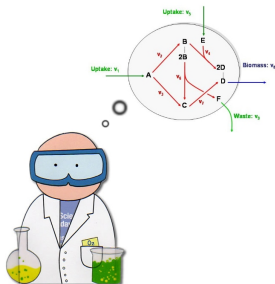
# Why simulate?



# Why simulate?



# Why simulate?



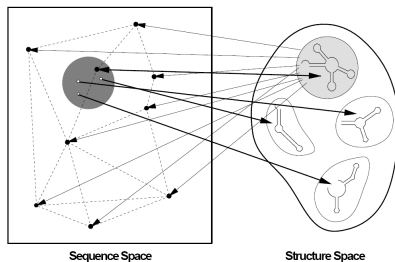


# HOW?



# RNA sequence-to-structure map

- **Redundancy:** Many more sequences than structures.
- **Sensitivity:** Small changes in the sequences may lead to large changes in the structure.
- **Neutrality:** A substantial fraction of mutations does not alter the structure.



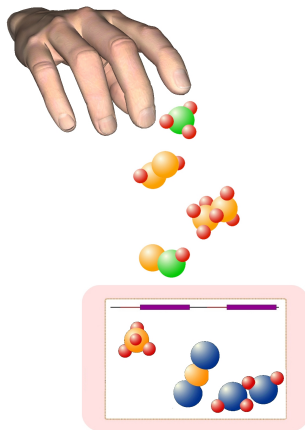
Walter Fontana & Peter Schuster, *J. Theor. Biol.* 194:491-515 (1998)

# Cell with Genome

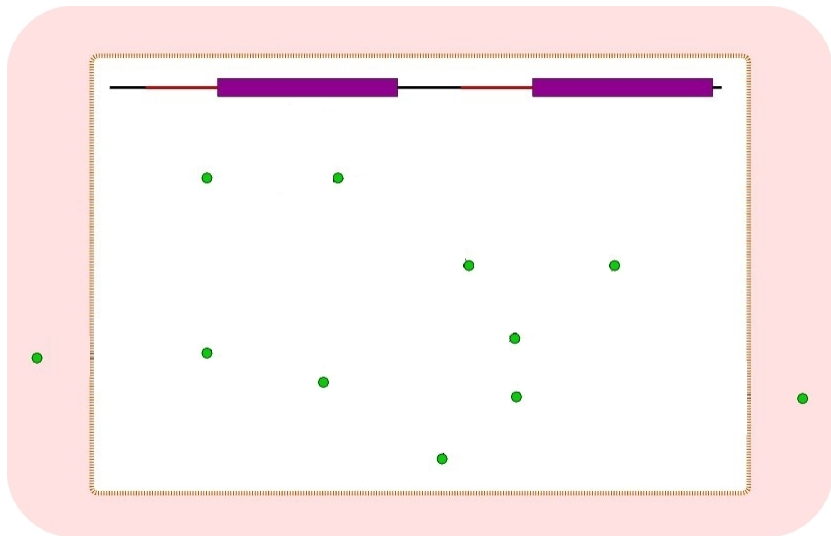


# Adding Metabolites

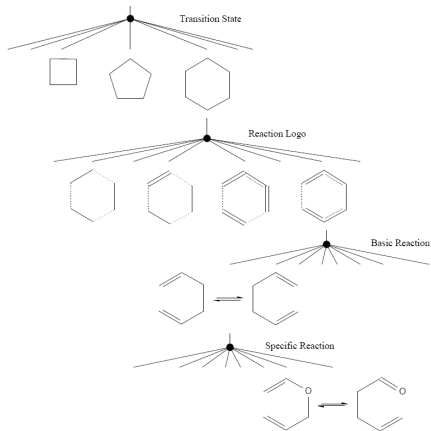
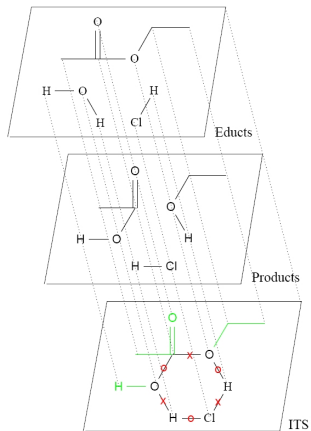
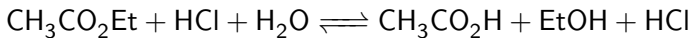
- Molecules are abstracted to vertex and edge labeled graphs
- Neighborhood relations are preserved by this abstraction.
- Spatial properties (e.g. Chirality, E/Z isomery) can be handled by extending the label set.
- Use graph-indices and QM to calculate physical properties



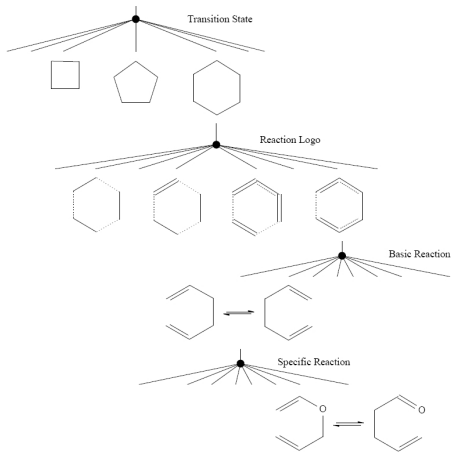
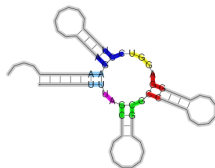
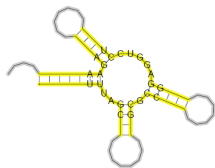
# Cell with Genome and Metabolites



# Reaction Classification



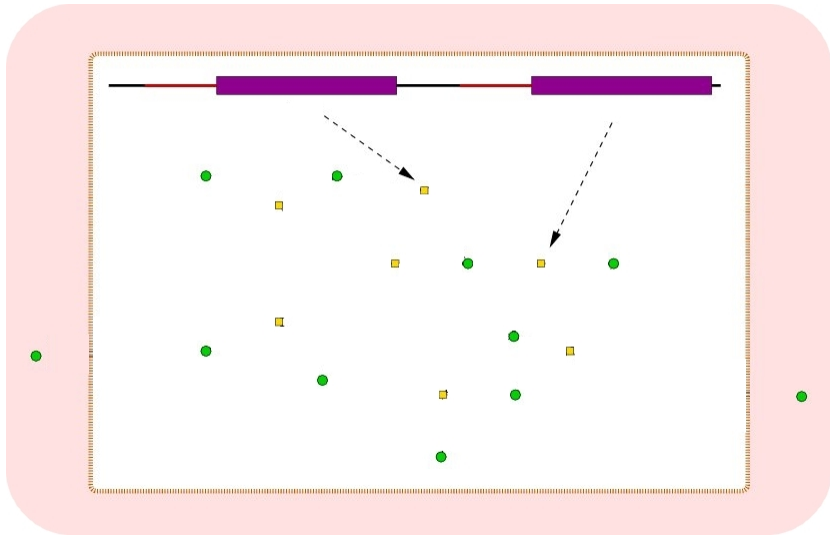
# From structure to function



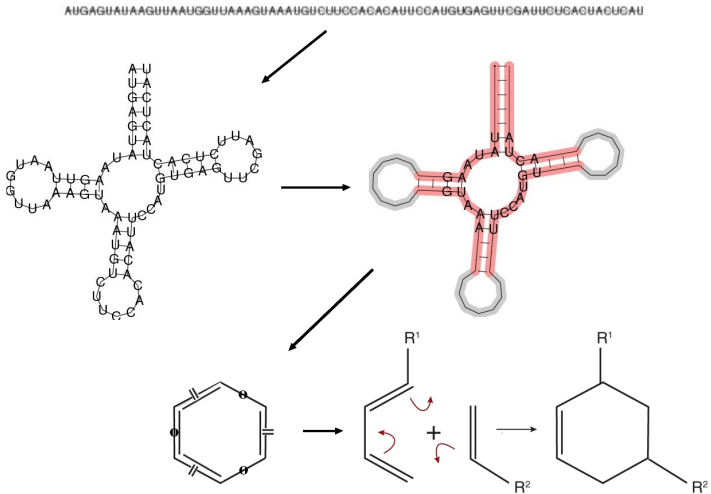
Neutrality is higher than in the RNA sequence-to-structure map.



# Cell with Genome, Metabolites and Enzymes

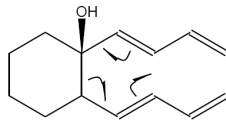
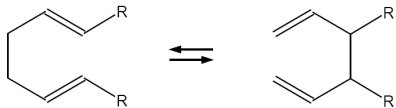


# From gene to function

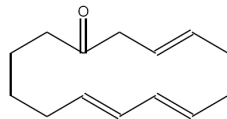
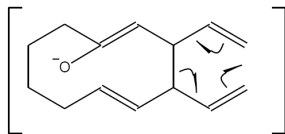
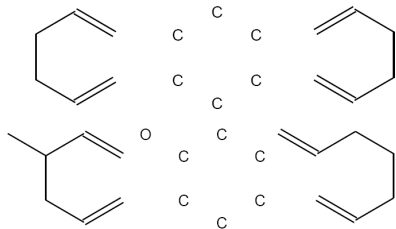


# Chemical Reaction as Graph Rewrite Rule

Cope Rearrangement

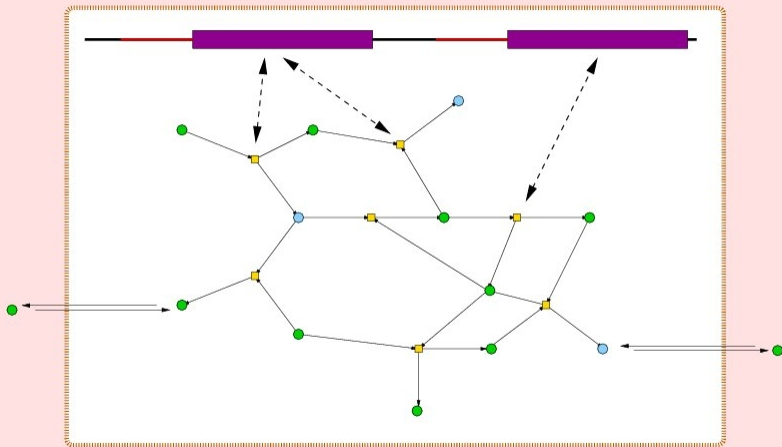


Rewrite Rules



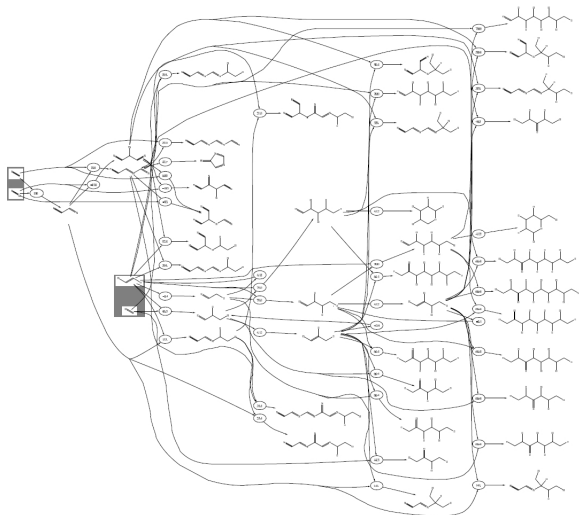
Graph-grammars are a context sensitive language!

# The Cell



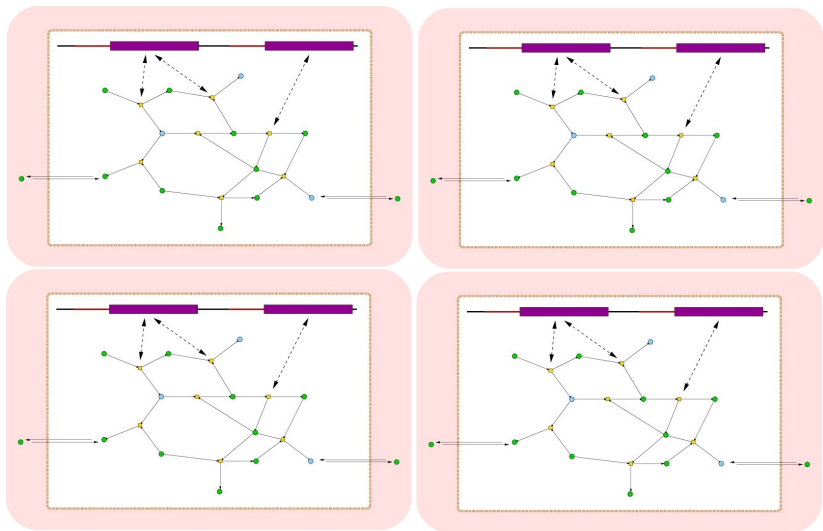
# THE NEXT STEP!

# Iterating the Graph Grammar



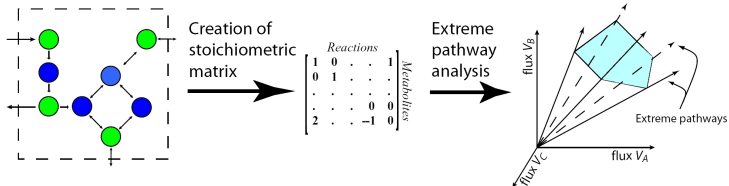
cyanide, formaldehyde glycol; aldolcondensation, tautomerization

# Cell-Population

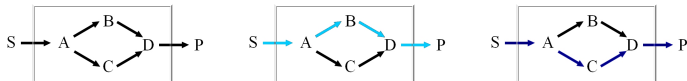


# Analysis of the networks

- **Metabolic Pathway Analysis**



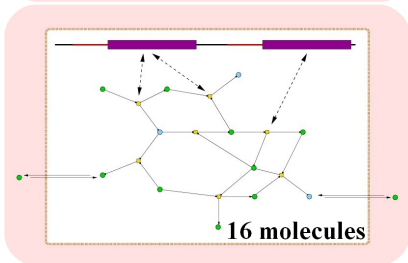
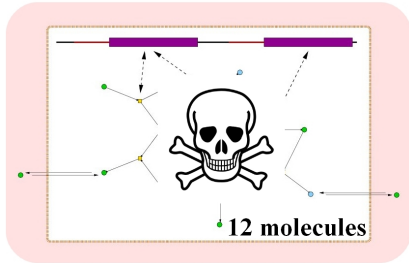
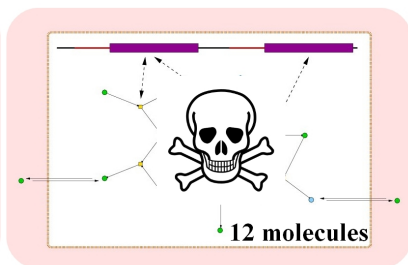
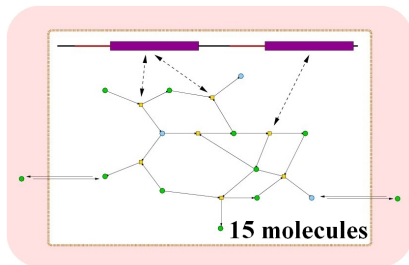
- **Pathway Distribution** using extreme pathways



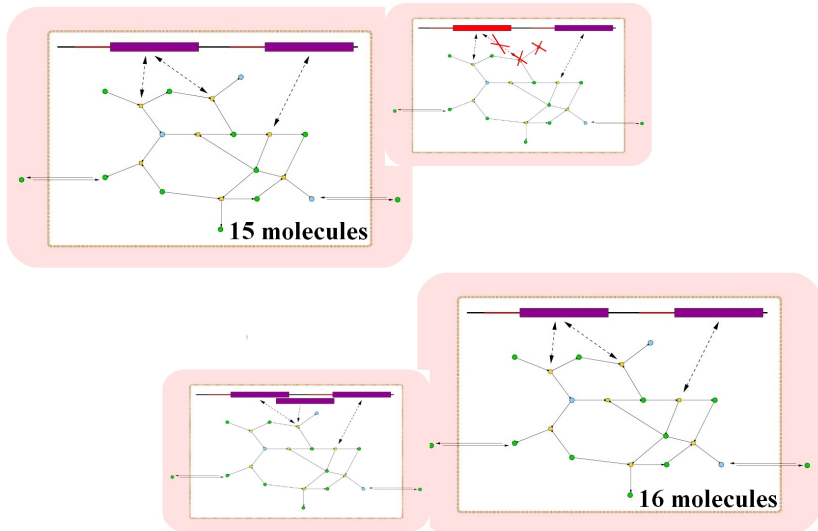
- Calculating the Yield of all extreme pathways
- At least one of those Pathways has optimal Yield



# Selection

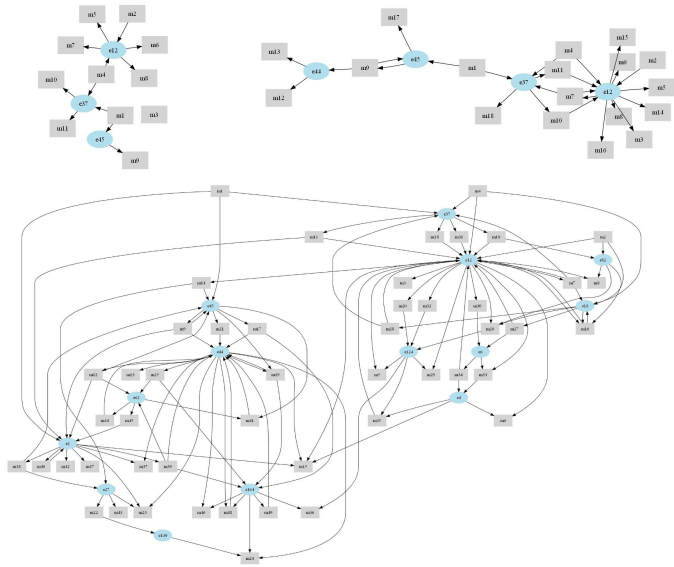


# The next Generation

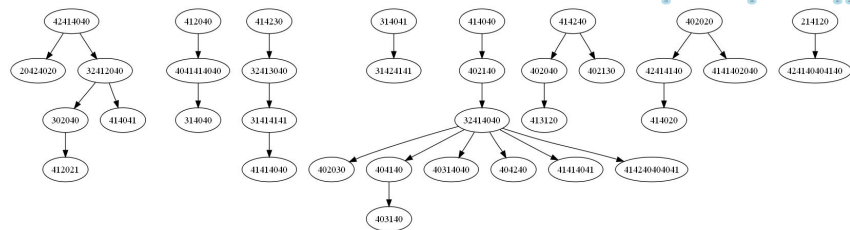
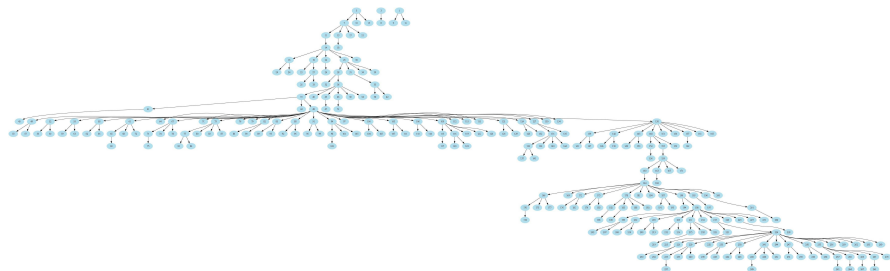


# Analysis

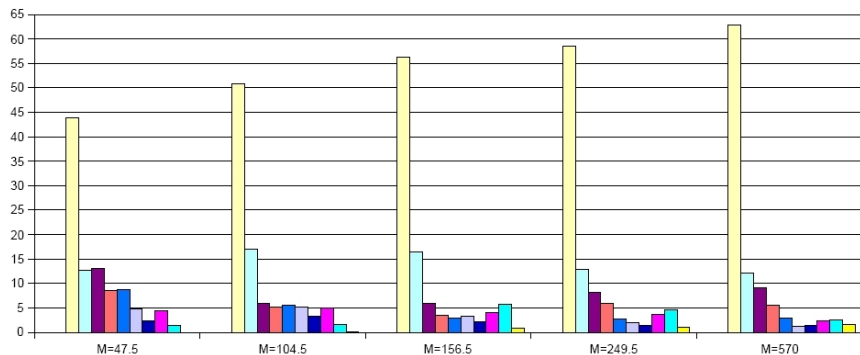
# Network Graphs



# Cell/Enzyme Evolution



# Connectivities

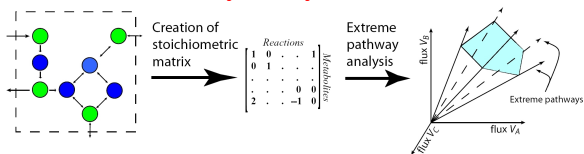


Enzyme	e37	e45	e12	e44	e18	e27	e6	e82	e4	e62	e124	e130	e2
Generation	1	1	1	2	3	3	7	10	14	42	44	51	53
Connectivity	4	5	12	9	4	2	2	2	2	2	3	1	6

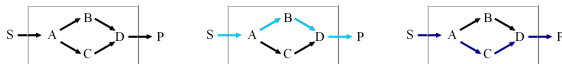
Specificity of enzymes in the example network

# Analysis of metabolic networks

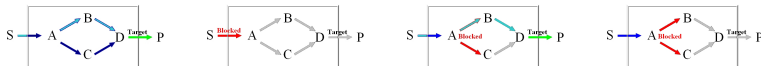
## Metabolic Pathway Analysis



## Pathway Distribution using extreme pathways



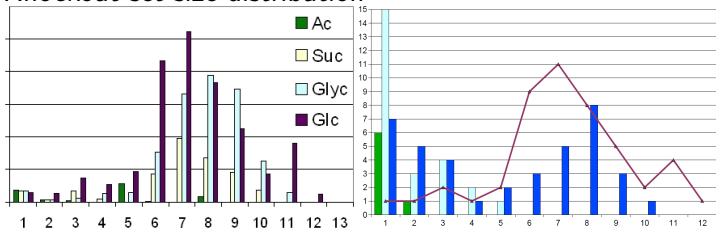
## Knockout Analysis using minimal knockout sets



## Viable Conditions using the notion of biological organizations

# Measuring Robustness

- Knockout set size distribution



- Elementary mode measures

$$R_1 = \frac{\sum_{i=1}^r z^{(i)}}{r \cdot z}$$

$$R_2 = \frac{\sum_i R_1^{(i)}}{n}$$

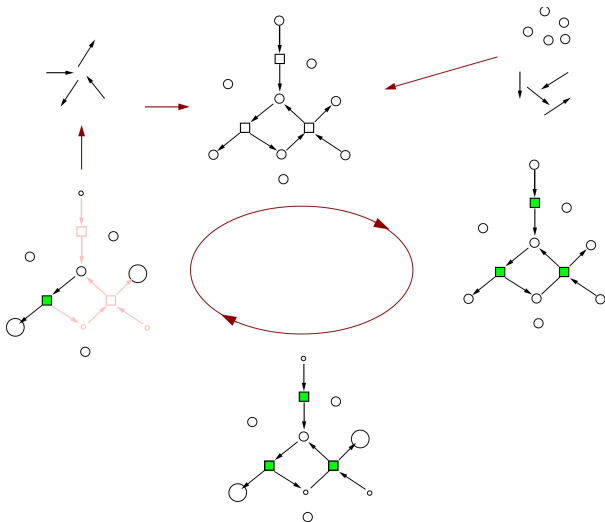
$$R_3 = \min \left\{ R_1^{(1)}, R_1^{(2)}, \dots, R_1^{(n)} \right\}$$



# Problems and Solutions

- Combinatorial Explosion of the Networks
- Open-ended Simulation

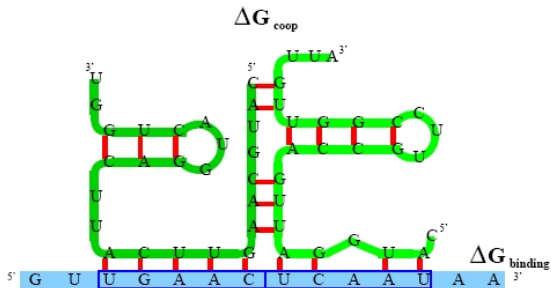
# Avoiding Combinatorial Explosion



Faulon, J-L, (2001) J Chem Inf Comput Sci 41:894-908

# Adding Complexity

- Introduction of further functions for metabolites
  - Biomass, Membrane, Genetic material, ...
- Introduction of further functions for enzymes
  - Catalyst, Transporter, Transcription factor, ...



## Thanks to:

- University of Vienna
    - Christoph Flamm
    - The entire TBI-Group (Ilenia, Ronny, Dill, Christian, ...)
  - University of Leipzig
    - Peter Stadler
    - Konstantin Klemm
  - EBI
    - Lukas Endler
  - University of Freiburg
    - Martin Mann
  - Wiener Wissenschafts-, Forschungs- und Technologiefonds (WWTF) for Funding
- You for listening!