

# Endless evolutionary paths to Virtual Microbes

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# OUTLINE

## BACKGROUND

evolution in Virtual Cells

## MODEL OVERVIEW

## OBSERVATIONS

Metabolisms in Flux

TF regulation

## CONCLUSIONS

## ACKNOWLEDGEMENTS

# EVOLVABILITY

(micro) organisms show a remarkable ability to adapt rapidly under stress or changing conditions  
in vivo

- ▶ rapid extensive transcriptional changes (yeast) <sup>1</sup>
- ▶ adaptation to experimental condition by parallel gene loss and point mutations (e. coli) <sup>2</sup>

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Question: does evolvability evolve?

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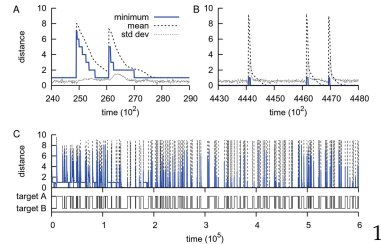
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# IN SILICO

when environment alternates between discreet states

- ▶ genome restructuring
- ▶ regulatory changes



biases spectrum towards favourable mutations

<sup>1</sup>Crombach & Hogeweg, 2008

# IN BIOLOGY

However

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- ▶ organisms *sense* their environment
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Redefined question: how do evolvability, regulation and ecosystem interact?

# EVOLUTION OF EVOLVABILITY

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- ▶ regulation may interfere with evolution of evolvability
- ▶ evolution of evolvability can imprint GRN as well as genome structure

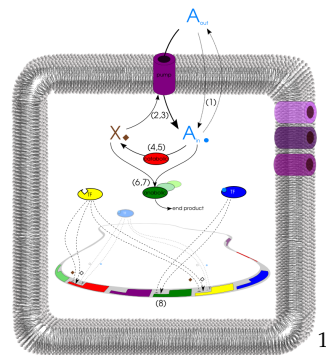
# VIRTUAL CELLS

Virtual Cell model has

- ▶ TFs sense internal metabolites
- ▶ continuous environment
- ▶ also drastic environmental change
- ▶ evolve for homeostasis

Mutations:

- ▶ genome scale → dup, del, invert, translocate
- ▶ genes:
  - ▶ enzymes → alter metabolic constants
  - ▶ sequences → bit string mutations

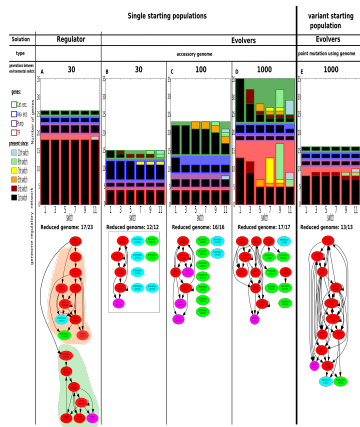


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# DIFFERENT STRATEGIES EVOLVE

We observed:

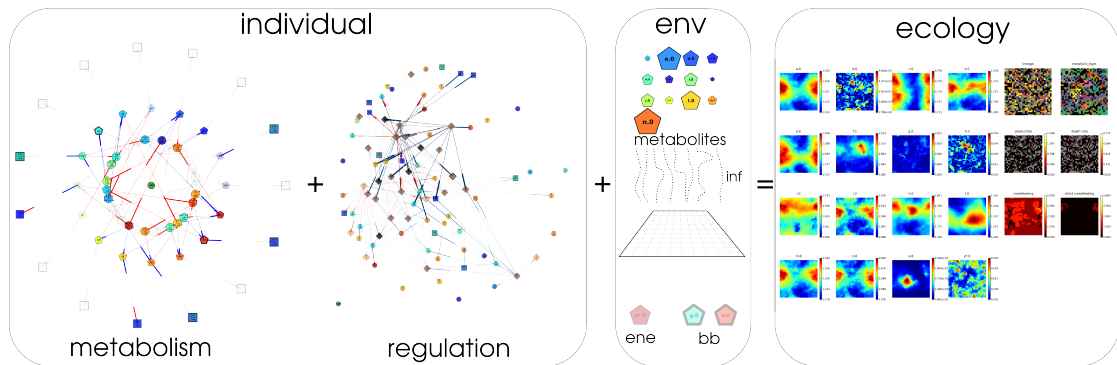
- ▶ evolution of *homeostasis* regulation
- ▶ fast readaptation when change is drastic
- ▶ competition between evolutionary adaptation and regulation (timescales)



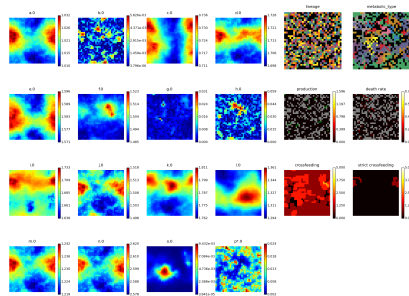
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<sup>1</sup>in collaboration with Jaap Rutten (in progress)

# TOWARDS VIRTUAL MICROBES

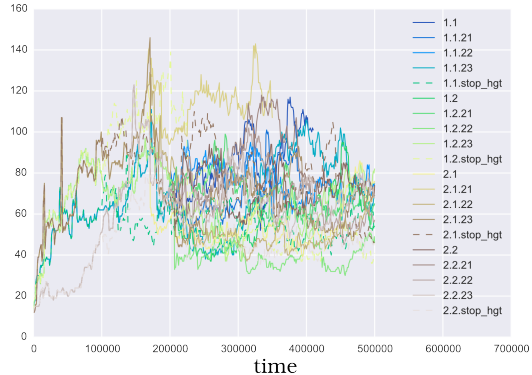


## WHAT IS THERE TO DO?



no explicit fitness function that can be optimized (cf. Virtual Cell), instead:

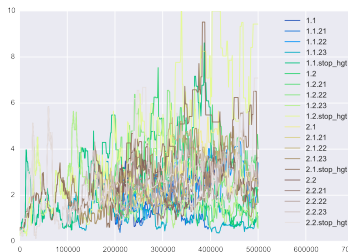
- ▶ increase *production* through metabolism
- ▶ avoid *toxic* build up of internal metabolites
- ▶ *ecosystem* feedback changes the fitness seascape.



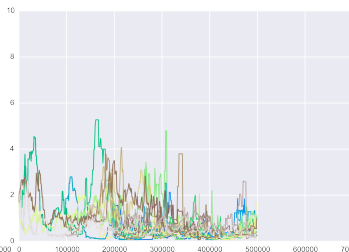
at  $t = 200000$  change from fluctuating to constant environment Fast initial increase, and tendency to reduce on long time scale (cf. Knibbe & Beslon, Cuypers & Hogeweg)

# GENE EXPRESSION

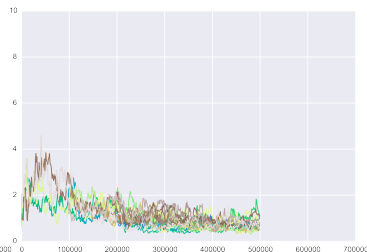
pumps



tfs



enzymes



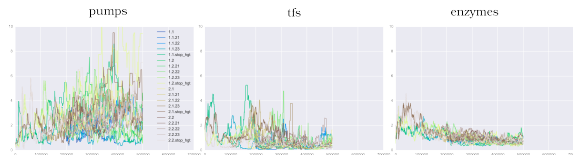






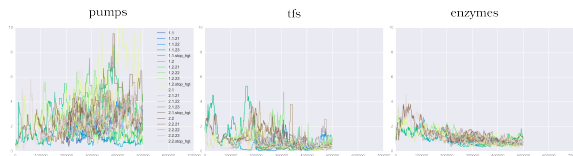
# GENE EXPRESSION

*why do pump and enzyme expression have opposite evolutionary pattern?*



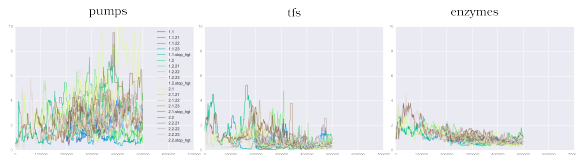
# GENE EXPRESSION

*why do pump and enzyme expression have opposite evolutionary pattern?*



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*why do pump and enzyme expression have opposite evolutionary pattern?*



- ▶ too high internal concentrations can be toxic
- ▶ increasing metabolic enzymes can *dissipate* high resource concentration (metabolic regulation)
- ▶ once, established, it becomes safe to pump
- ▶ fine tuning of enzymes can minimize cost of expression

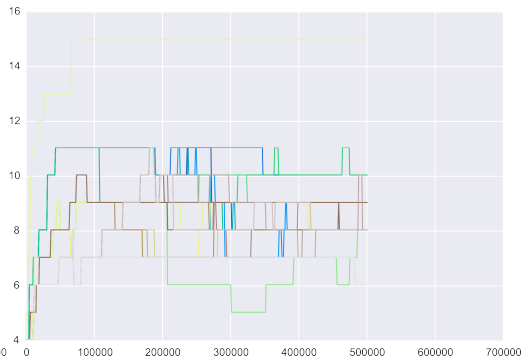


# EVOLVING RESOURCE EXPLOITATION

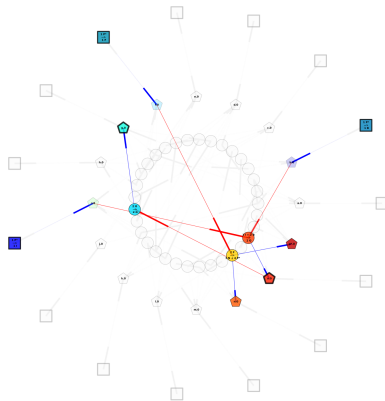
consumed



produced



# CONTINUOUS CHANGE IN LINE OF DESCENT



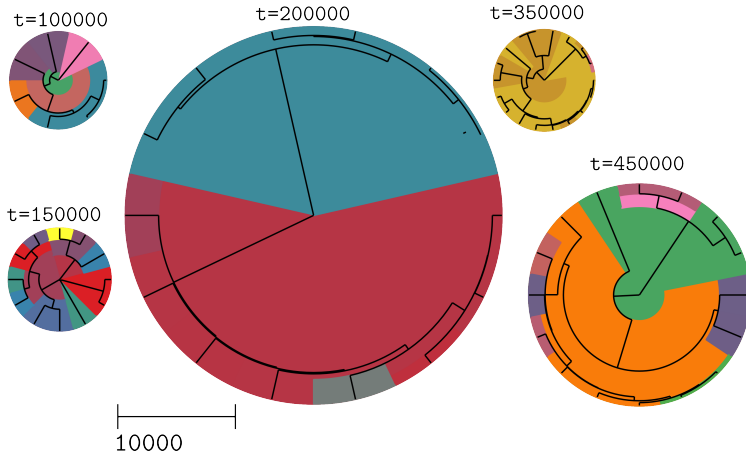
# METABOLISMS IN FLUX

even though organisms quickly learn to exploit all metabolites, metabolism network remains in flux.

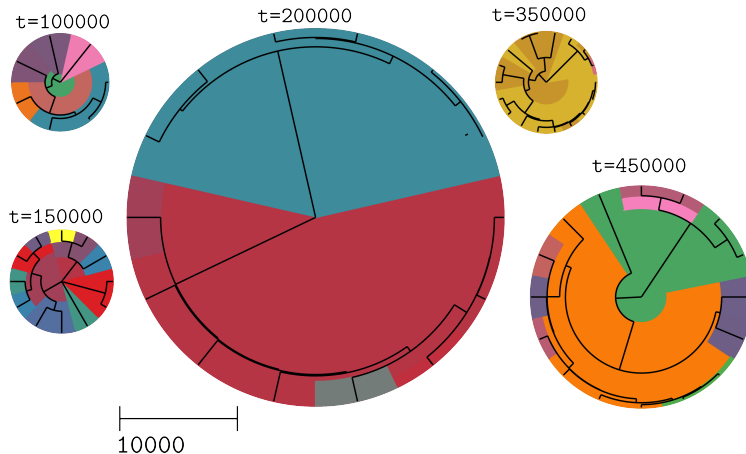
sustained flux in constant environment

driven by external HGT

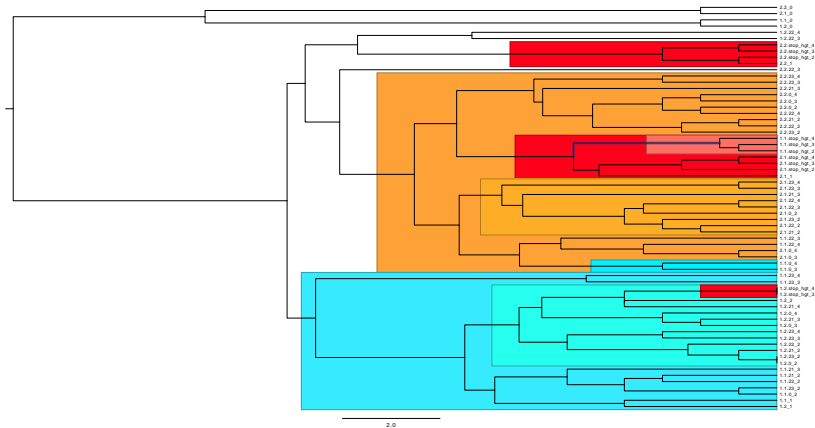




# WITHIN POPULATION DIVERSITY

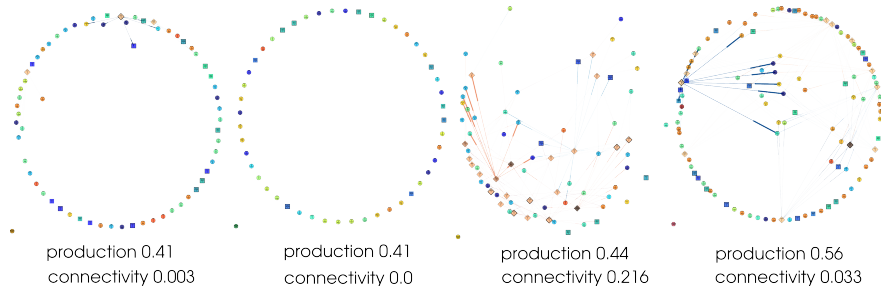


*different metabolic types coexist at intermediate evolutionary time scales*

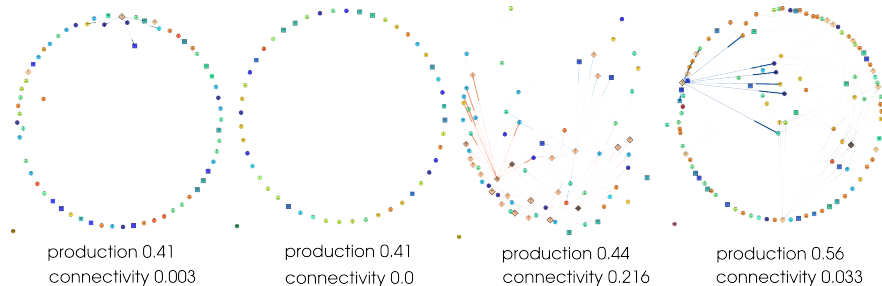




## WHAT ABOUT REGULATION?



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*highly variable between evolutionary runs maintenance depends on environmental change*

# CONCLUSIONS

- ▶ microbes quickly evolve metabolic networks
- ▶ despite strong selection due to toxicity, high metabolic variation
- ▶ metabolisms in flux over evolutionary time
- ▶ continuous evolution of population diversity
- ▶ strong contingency of evolutionary trajectories

# ACKNOWLEDGEMENTS

- ▶ Paulien Hogeweg
- ▶ Bram van Dijk
- ▶ all members of the evoevo
- ▶ ECAL organizers



# Evolution of Evolution