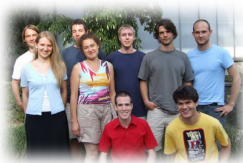




Teaching cells how to add numbers

ETH Zürich



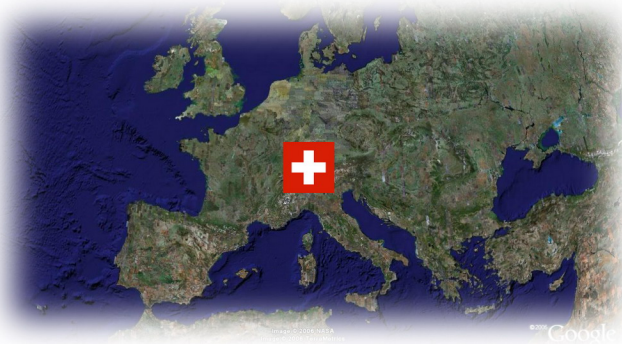
Who are we and where are we from?



Who are we and where are we from?



Who are we and where are we from?

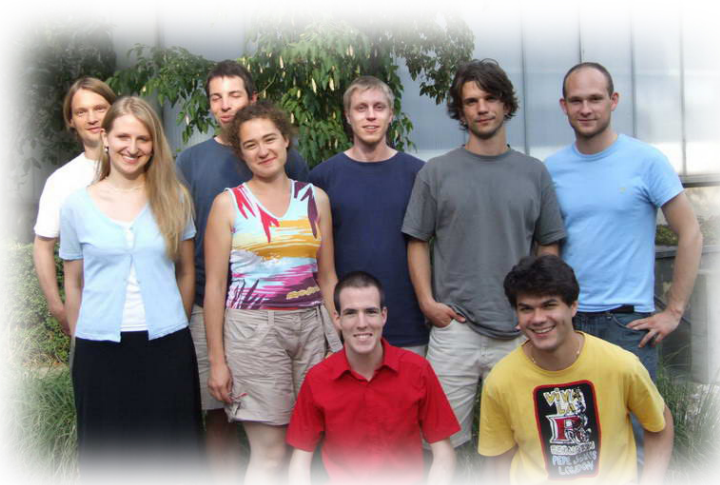




Who are we and where are we from?



The ETH Zurich iGEM team 2006



Contents

- 1 Applications of our System
- 2 Model based design – the XOR gate
- 3 Biological Implementation of the gates
- 4 Experiments and Results

Contents

- 1 Applications of our System
- 2 Model based design – the XOR gate
- 3 Biological Implementation of the gates
- 4 Experiments and Results

Contents

- 1 Applications of our System
- 2 Model based design – the XOR gate
- 3 Biological Implementation of the gates
- 4 Experiments and Results

Contents

- 1 Applications of our System
- 2 Model based design – the XOR gate
- 3 Biological Implementation of the gates
- 4 Experiments and Results

- 1 Applications of our System
 - Addition for cells (biologist's desk calculator)
 - Shading effects that the world waited for
- 2 Model based design – the XOR gate
 - System modeling
 - Steady-state behavior simulation
 - Steady-state sensitivity analysis
- 3 Biological Implementation of the gates
 - The XOR-gate
 - The AND-gate
- 4 Experiments and Results
 - Experiments
 - Summary

Direct application of our system



perfect match



less congruent



artistic

Adding numbers

$$4 + 18 = ?$$

Adding numbers

$$4 + 18 = ?$$



One decimal position after the other

$$\begin{array}{r} 4 \\ + 1 8 \\ \hline \text{Carry} \\ \text{Sum} \\ \hline \hline \end{array}$$

One decimal position after the other

$$\begin{array}{r} 04 \\ + 18 \\ \hline \text{Carry} \\ \text{Sum} \\ \hline \hline \end{array}$$

One decimal position after the other

$$\begin{array}{r} 04 \\ + 18 \\ \hline \text{Carry } 1 \\ \text{Sum} 2 \\ \hline \hline \end{array}$$

One decimal position after the other

$$\begin{array}{r} 04 \\ + 18 \\ \hline \text{Carry } 1 \\ \text{Sum} 2 \\ \hline \hline \end{array}$$

One decimal position after the other

$$\begin{array}{r} 04 \\ + 18 \\ \hline \text{Carry } 1 \\ \text{Sum } 22 \\ \hline \hline \end{array}$$

One decimal position after the other

$$\begin{array}{r} 04 \\ + 18 \\ \hline \text{Carry } 1 \\ \text{Sum } \color{red}{2} \color{red}{2} \\ \hline \hline \end{array}$$

Same principle for binary addition

$$\begin{array}{r} \\ + \\ \hline \text{Carry} \\ \text{Sum} \\ \hline \hline \end{array}$$

Same principle for binary addition

$$\begin{array}{r} \\ + \\ \hline \text{Carry} \\ \text{Sum} \\ \hline \hline \end{array}$$

Same principle for binary addition

$$\begin{array}{r} \\ \\ + \\ \hline \text{Carry} \\ \text{Sum} \\ \hline \hline \end{array}$$

A binary addition diagram showing the sum of 01 and 11. The first row shows the numbers 0 and 1. The second row shows the numbers 1 and 1. A horizontal line separates the numbers from the result. Below the line, the word 'Carry' is followed by a green '1', and the word 'Sum' is followed by a green '0'. A double horizontal line is drawn below the 'Sum' row.

Same principle for binary addition

$$\begin{array}{r} \\ \\ + \\ \hline \text{Carry} \\ \\ \text{Sum} \\ \hline \hline \end{array}$$

Same principle for binary addition

$$\begin{array}{r}
 \\
 \\
 + \\
 \hline
 \text{Carry} \\
 \phantom{\text{Carry}} \\
 \text{Sum} \\
 \hline
 \hline
 \end{array}$$

Same principle for binary addition

$$\begin{array}{r}
 \\
 \\
 + \\
 \hline
 \text{Carry } 1 \\
 \text{Sum} \\
 \hline
 \hline
 \end{array}$$

Same principle for binary addition

$$\begin{array}{r}
 \\
 1 \\
 + 1 1 \\
 \hline
 \text{Carry } 1 1 \\
 \text{Sum } 1 0 0 \\
 \hline
 \hline
 \end{array}$$

Same principle for binary addition

$$\begin{array}{r}
 \\
 1 \\
 + 1 \\
 \hline
 \text{Carry} 1 \\
 \text{Sum} \color{red}{1} \color{red}{0} \\
 \hline
 \hline
 \end{array}$$

Logic used for calculations in binary

A	B	Carry	Sum
0	0	0	0

Logic used for calculations in binary

A	B	Carry	Sum
0	0	0	0
0	1	0	1

Logic used for calculations in binary

A	B	Carry	Sum
0	0	0	0
0	1	0	1
1	0	0	1

Logic used for calculations in binary

A	B	Carry	Sum
0	0	0	0
0	1	0	1
1	0	0	1
1	1	1	0

Logic used for calculations in binary

A	B	Carry	Sum
0	0	0	0
0	1	0	1
1	0	0	1
1	1	1	0

A	B	XOR
0	0	0
0	1	1
1	0	1
1	1	0

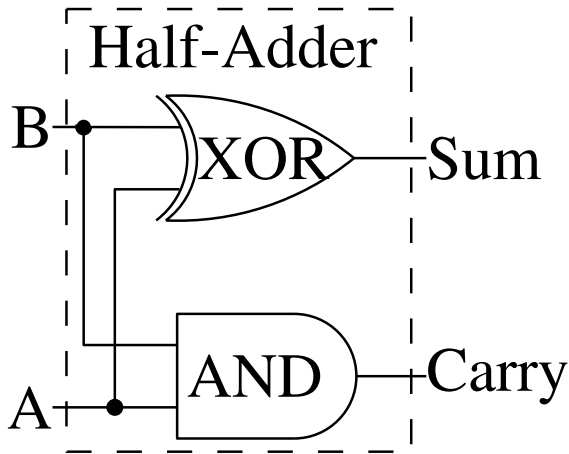
Logic used for calculations in binary

A	B	Carry	Sum
0	0	0	0
0	1	0	1
1	0	0	1
1	1	1	0

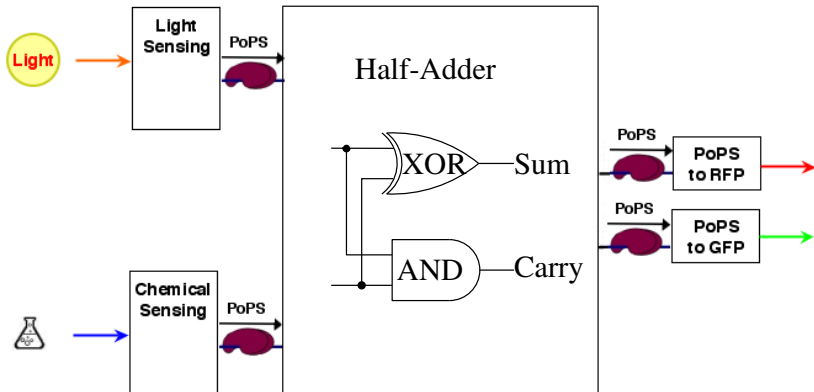
A	B	AND
0	0	0
0	1	0
1	0	0
1	1	1

A	B	XOR
0	0	0
0	1	1
1	0	1
1	1	0

Logic used for calculations in binary

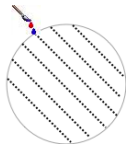


Building a system around the half-adder



Building a system around the half-adder

1. put chemical to plate



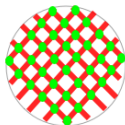
2. let bacteria grow uniformly



3. expose them to light

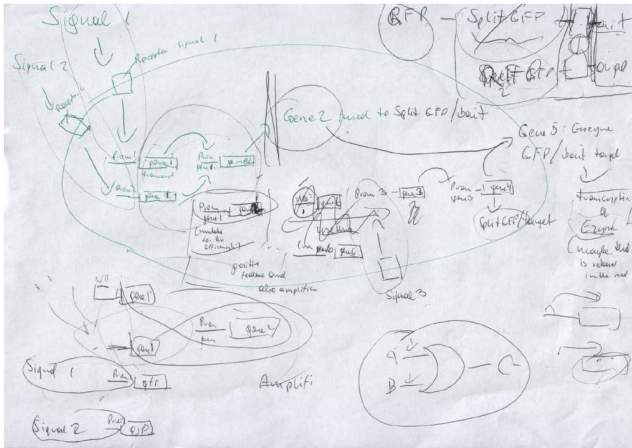


4. expected result

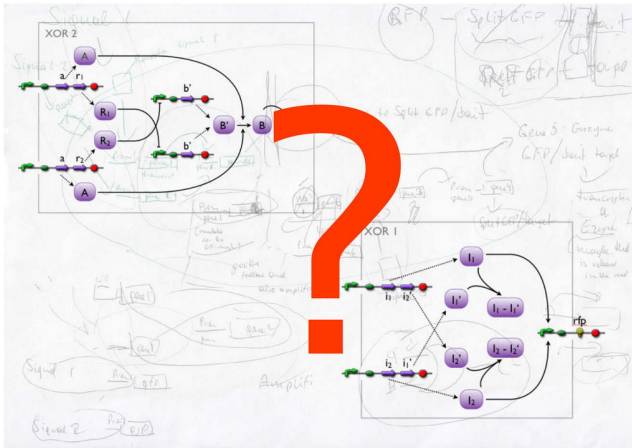


- 1 Applications of our System
 - Addition for cells (biologist's desk calculator)
 - Shading effects that the world waited for
- 2 **Model based design – the XOR gate**
 - System modeling
 - Steady-state behavior simulation
 - Steady-state sensitivity analysis
- 3 Biological Implementation of the gates
 - The XOR-gate
 - The AND-gate
- 4 Experiments and Results
 - Experiments
 - Summary

XOR concepts



XOR concepts



Requirements

- 1 Biologically feasible
- 2 Appropriate steady-state behavior
- 3 Robust to uncertainty
- 4 Appealing

Requirements

- 1 Biologically feasible
- 2 Appropriate steady-state behavior
- 3 Robust to uncertainty
- 4 Appealing

Requirements

- 1 Biologically feasible
- 2 Appropriate steady-state behavior
- 3 Robust to uncertainty
- 4 Appealing

Requirements

- 1 Biologically feasible
- 2 Appropriate steady-state behavior
- 3 Robust to uncertainty
- 4 Appealing

Requirements

- 1 Biologically feasible
- 2 **Appropriate steady-state behavior**
- 3 **Robust to uncertainty**
- 4 Appealing

→ estimated using a model

Dynamic system model

$$\frac{\partial \vec{c}(t)}{\partial t} = \vec{f}(\cdot)$$

$\vec{c}(t)$: Concentrations

Dynamic system model

$$\frac{\partial \vec{c}(t)}{\partial t} = N \cdot \vec{r}(\vec{c}(t), \vec{u}(t), \vec{p}, t)$$

$\vec{c}(t)$: Concentrations

N : Stoichiometric matrix

$\vec{r}(\cdot)$: Reaction rates (kinetic rate law)

$\vec{u}(t)$: Inputs / external influences

\vec{p} : Parameters (kinetic constants, ...)

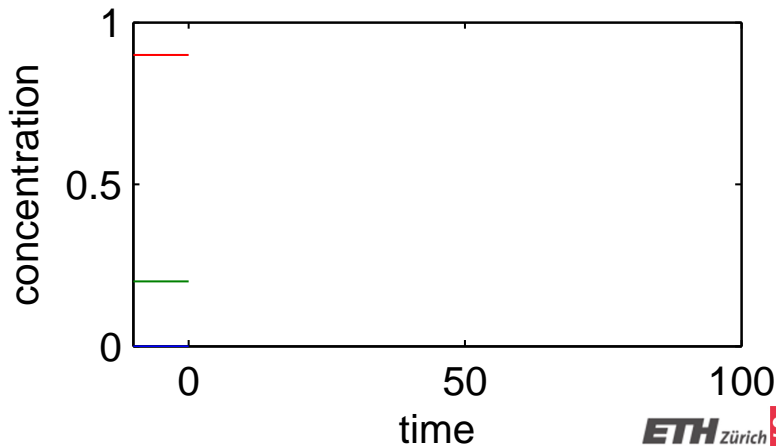
Dynamic system simulation

No closed-form solutions

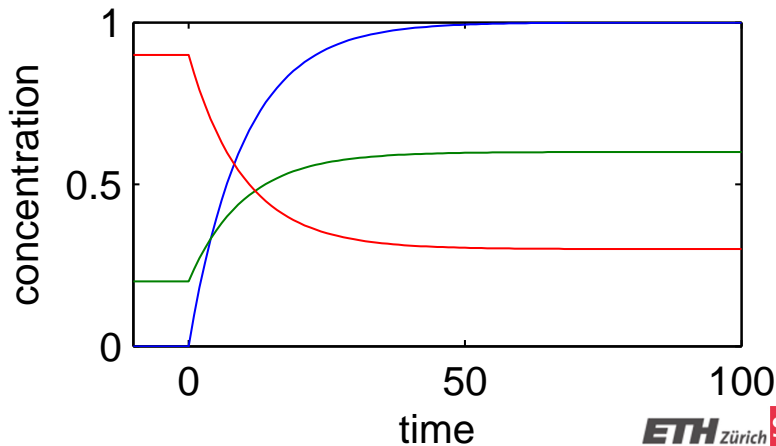
Dynamic system simulation

No closed-form solutions
→ numeric integration

Steady-state



Steady-state



Steady-state

Using steady-state as output because:

- **convenient** to measure: system remains there
- **robust** to disturbances
- **exists** in most practical systems

Steady-state

Using steady-state as output because:

- **convenient** to measure: system remains there
- **robust** to disturbances
- **exists** in most practical systems

Steady-state

Using steady-state as output because:

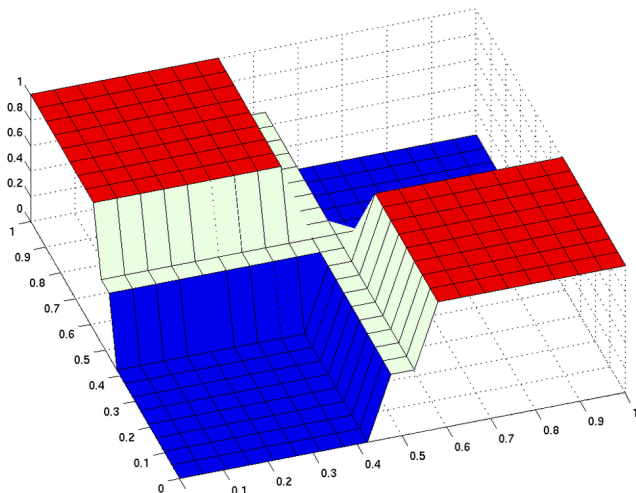
- **convenient** to measure: system remains there
- **robust** to disturbances
- **exists** in most practical systems

Steady-state

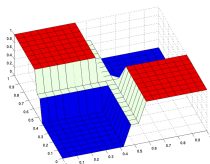
Using steady-state as output because:

- **convenient** to measure: system remains there
- **robust** to disturbances
- **exists** in most practical systems

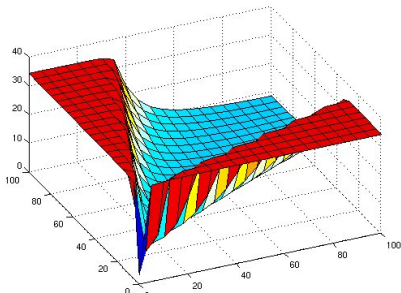
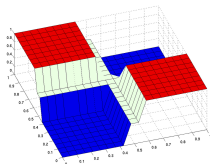
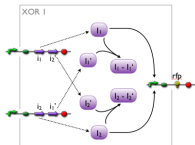
Steady-state behavior of a good XOR



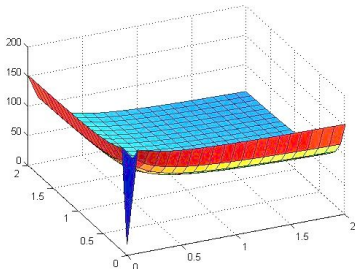
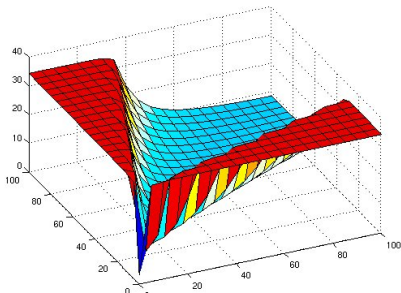
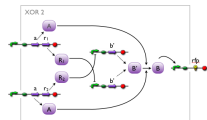
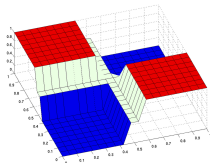
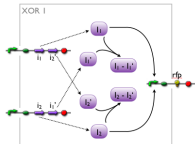
Simulated steady-state behavior of the concepts



Simulated steady-state behavior of the concepts



Simulated steady-state behavior of the concepts



Steady-state sensitivity

Steady-state sensitivity

- measures influence of parameter on steady-state → robustness
- algebraically derivable from model

Steady-state sensitivity

Steady-state sensitivity

- measures influence of parameter on steady-state → robustness
- algebraically derivable from model

Steady-state sensitivity

Steady-state sensitivity

- measures influence of parameter on steady-state → robustness
- algebraically derivable from model

Steady-state sensitivity

Sensitivity = 2

Steady-state sensitivity

Sensitivity = 2

Parameter change by 1%

Steady-state sensitivity

Sensitivity = 2

Parameter change by 1%

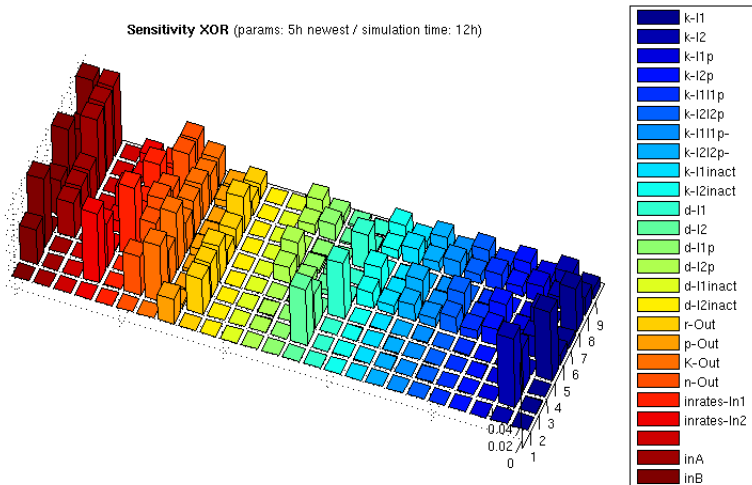


steady-state changes by 2%

Steady-state sensitivity

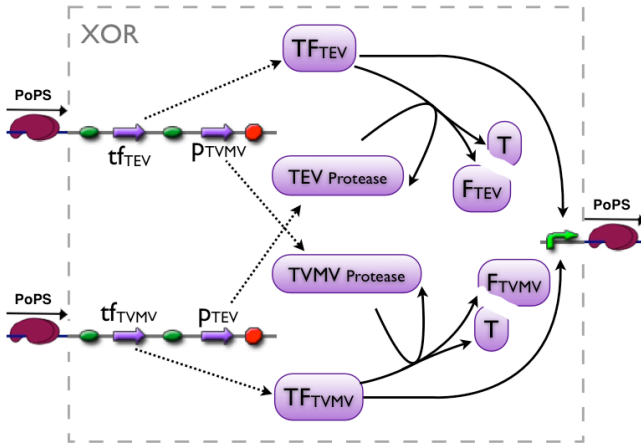
$$\begin{aligned} &\text{relative parameter change} \\ &\quad \times \\ &\quad \text{sensitivity} \\ &\quad = \\ &\text{steady-state change} \end{aligned}$$

Steady-state sensitivity: XOR output

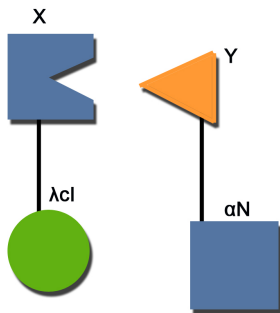


- 1 Applications of our System
 - Addition for cells (biologist's desk calculator)
 - Shading effects that the world waited for
- 2 Model based design – the XOR gate
 - System modeling
 - Steady-state behavior simulation
 - Steady-state sensitivity analysis
- 3 **Biological Implementation of the gates**
 - The XOR-gate
 - The AND-gate
- 4 Experiments and Results
 - Experiments
 - Summary

XOR overall system

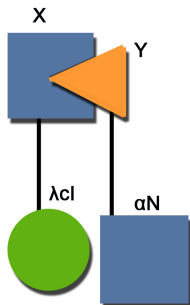


XOR inspiration



Reference: Dove and Hochschild, 1998

XOR inspiration



Reference: Dove and Hochschild, 1998

XOR main elements



XOR main elements



XOR main elements

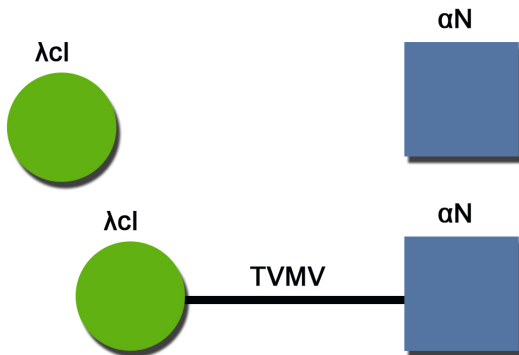
λ cl



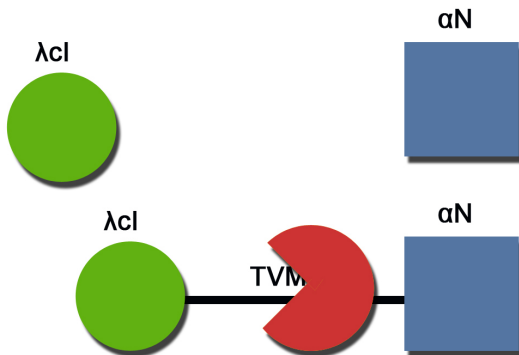
α N



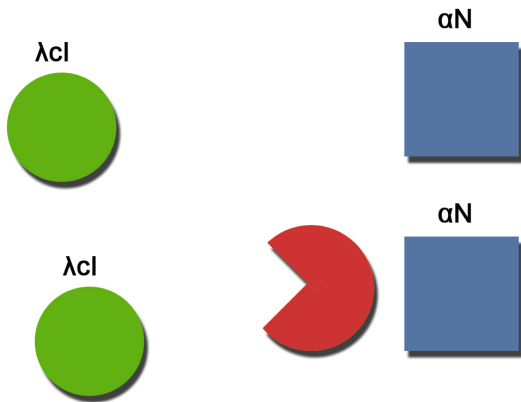
XOR main elements



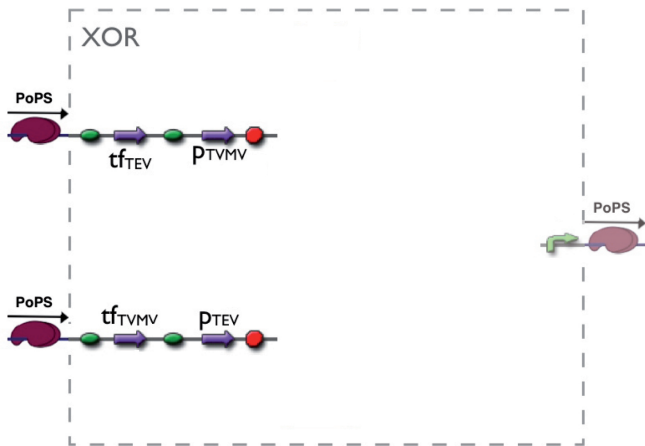
XOR main elements



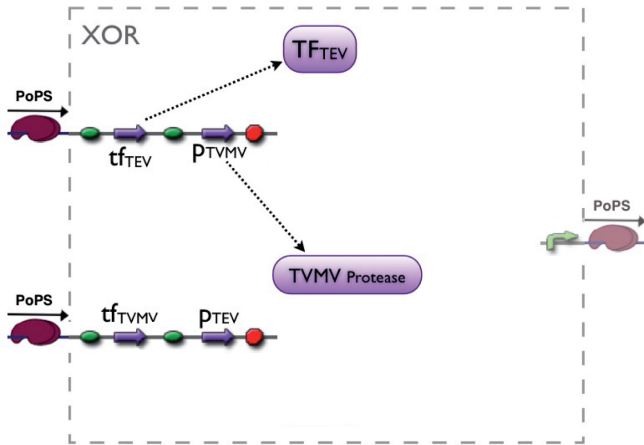
XOR main elements



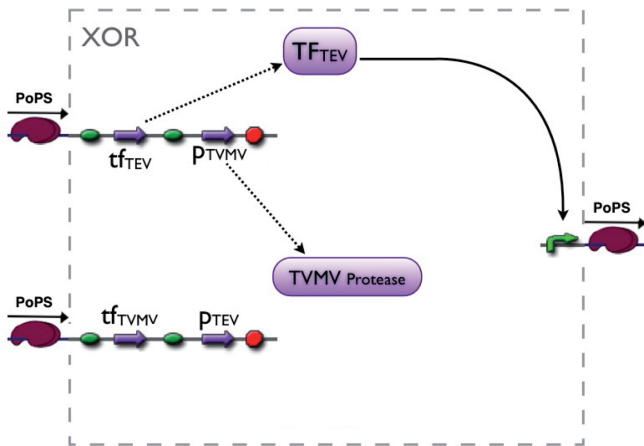
Functionality Overview



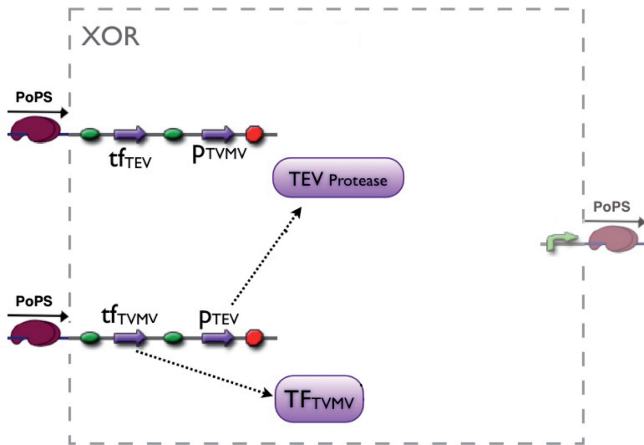
Functionality Overview



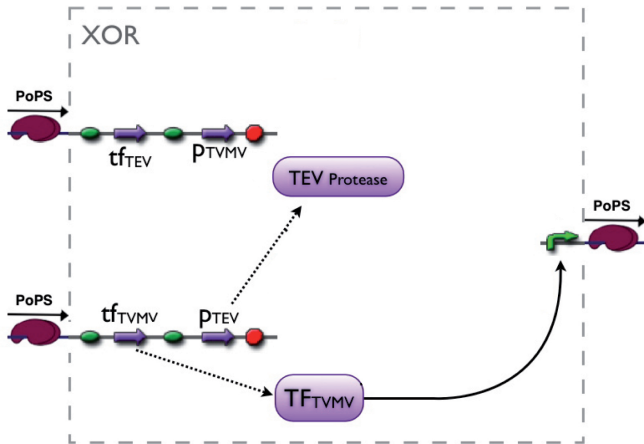
Functionality Overview



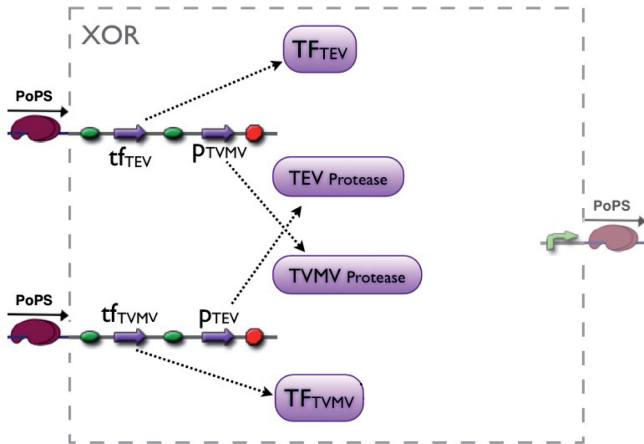
Functionality Overview



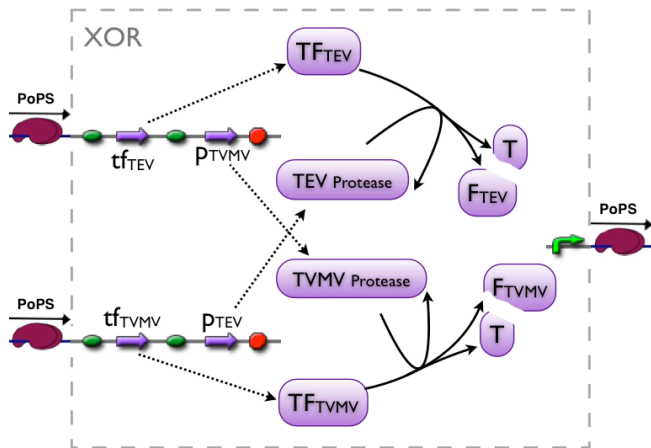
Functionality Overview



Functionality Overview



Functionality Overview



Design Advantages of the XOR

The XOR gate

- Very specific proteases, almost no off-target effects
- Active Proteases can be expressed in vivo
- In a functional *TF*, *AD* and *DBD* can be separated by various linkers

Design Advantages of the XOR

The XOR gate

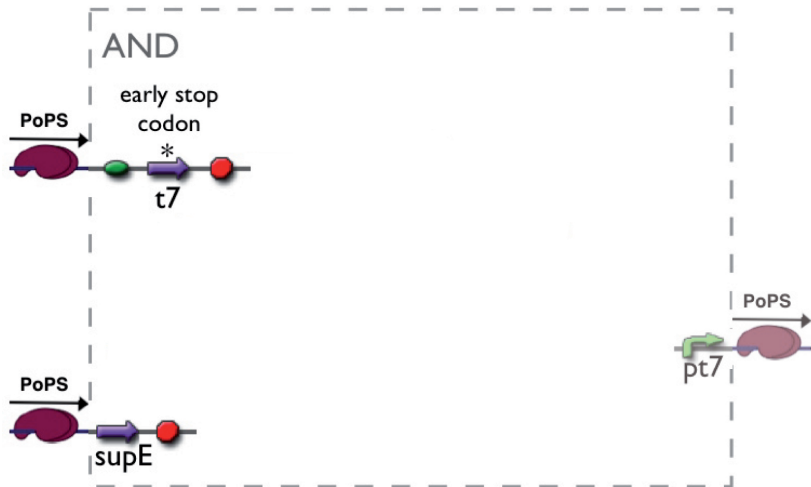
- Very specific proteases, almost no off-target effects
- Active Proteases can be expressed in vivo
- In a functional *TF*, *AD* and *DBD* can be separated by various linkers

Design Advantages of the XOR

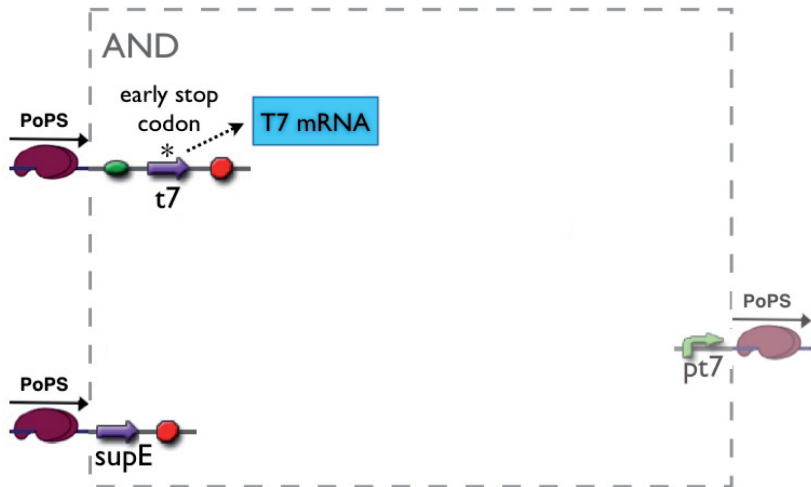
The XOR gate

- Very specific proteases, almost no off-target effects
- Active Proteases can be expressed in vivo
- In a functional *TF*, *AD* and *DBD* can be separated by various linkers

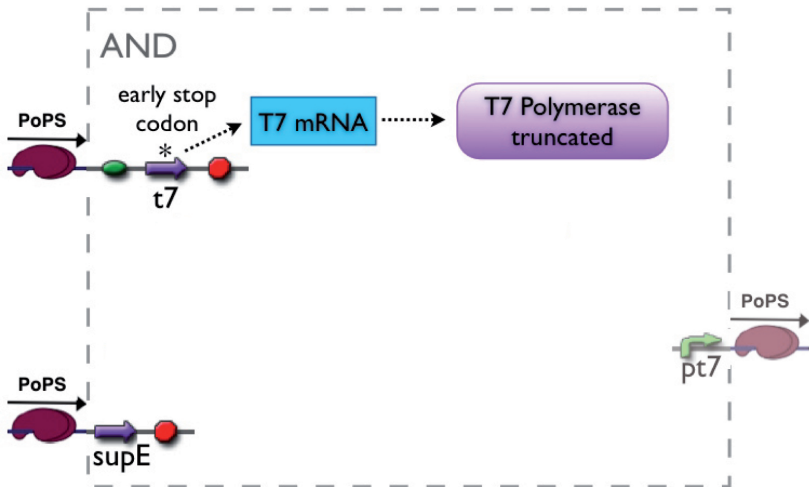
Functionality Overview



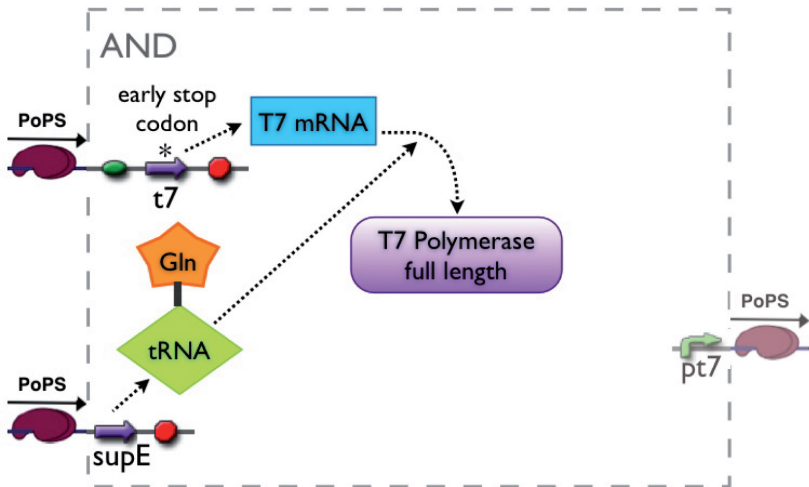
Functionality Overview



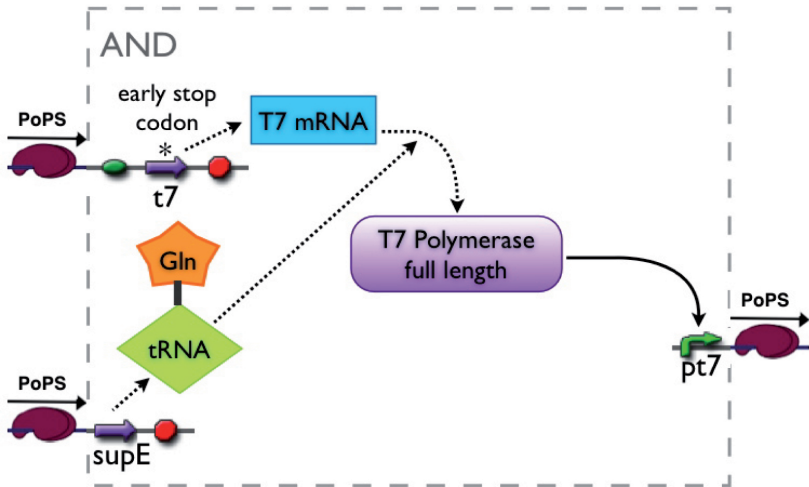
Functionality Overview



Functionality Overview



Functionality Overview



- 1 Applications of our System
 - Addition for cells (biologist's desk calculator)
 - Shading effects that the world waited for
- 2 Model based design – the XOR gate
 - System modeling
 - Steady-state behavior simulation
 - Steady-state sensitivity analysis
- 3 Biological Implementation of the gates
 - The XOR-gate
 - The AND-gate
- 4 Experiments and Results
 - Experiments
 - Summary

Input testing: chemical and light sensing

- Chemical sensing
- Light Sensing - from UCSF group



Light



No light

Gates Testing

- Test the gates operation via 2 inducible promoters
- Characterize behavior by varying strength and duration of inputs

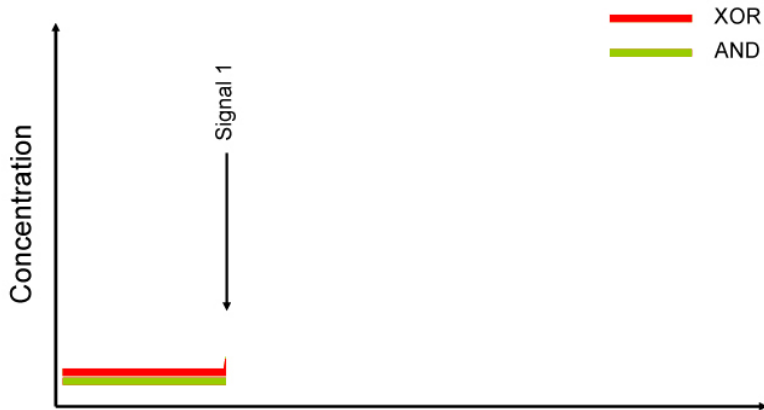
Expected results



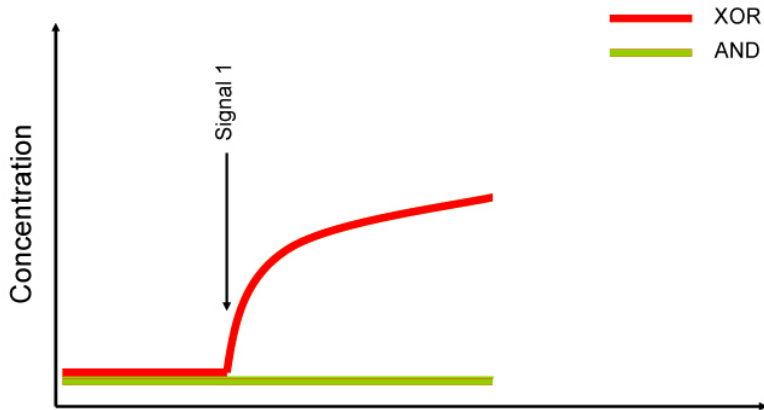
Expected results



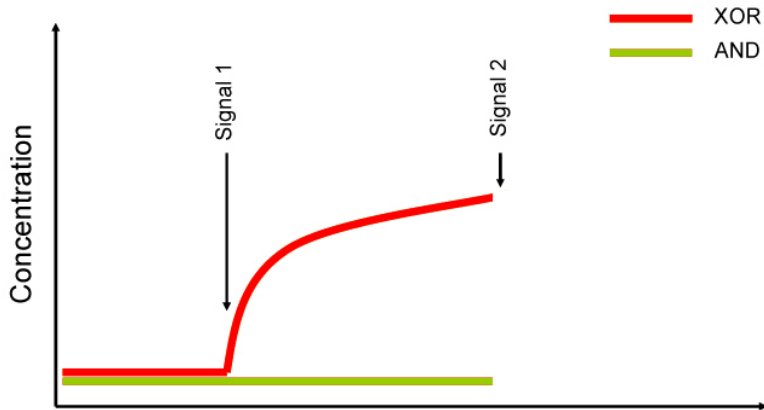
Expected results



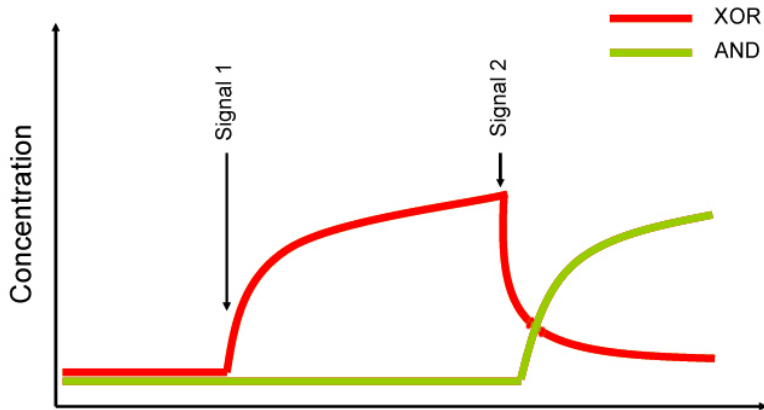
Expected results



Expected results



Expected results



System status

- Design and order DNA for XOR, AND gates
- Test chemical and light sensing systems
- Clone reporter genes into XOR, AND plasmids
- Combine gate segments: XOR (3), AND (2)
- Clone gates into plasmids and test separately
- Combine sensing and gate parts and test entire system

System status

- Design and order DNA for XOR, AND gates
- Test chemical and light sensing systems
- Clone reporter genes into XOR, AND plasmids
- Combine gate segments: XOR (3), AND (2)
- Clone gates into plasmids and test separately
- Combine sensing and gate parts and test entire system

System status

- Design and order DNA for XOR, AND gates
- Test chemical and light sensing systems
- Clone reporter genes into XOR, AND plasmids
- Combine gate segments: XOR (3), AND (2)
- Clone gates into plasmids and test separately
- Combine sensing and gate parts and test entire system

System status

- Design and order DNA for XOR, AND gates
- Test chemical and light sensing systems
- Clone reporter genes into XOR, AND plasmids
- **Combine gate segments: XOR (3), AND (2)**
- Clone gates into plasmids and test separately
- Combine sensing and gate parts and test entire system

System status

- Design and order DNA for XOR, AND gates
- Test chemical and light sensing systems
- Clone reporter genes into XOR, AND plasmids
- **Combine gate segments: XOR (3), AND (2)**
- **Clone gates into plasmids and test separately**
- Combine sensing and gate parts and test entire system

System status

- Design and order DNA for XOR, AND gates
- Test chemical and light sensing systems
- Clone reporter genes into XOR, AND plasmids
- **Combine gate segments: XOR (3), AND (2)**
- **Clone gates into plasmids and test separately**
- **Combine sensing and gate parts and test entire system**

Summary

- Design Half Adder
 - Perform addition in bacteria
 - Pattern recognition
- Logic gates
 - XOR two similar transcription factors with specific proteases
 - AND suppressor tRNA
- Learned a lot and enjoyed the process

Acknowledgments

Many thanks to the iGEM organisation team

And also thanks to the following people and institutions which supported us:

- Advisers: Sven, Jörg and Eckart
- ETH for infrastructure and financial support
- European Union for financial support
- Lab-people: Giorgia, Alex and Eric
- Ambassadors: Jonas, Tamara and Robin
- Anselm Levskaya and UCSF team

... and thank you

... and of course thank YOU for your attention.
Are there any questions?