

# Distributed Computing on the (Fruit) Fly

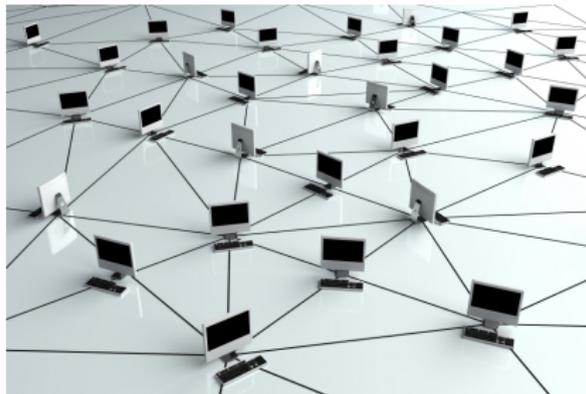
Yuval Emek

Technion - Israel Institute of Technology

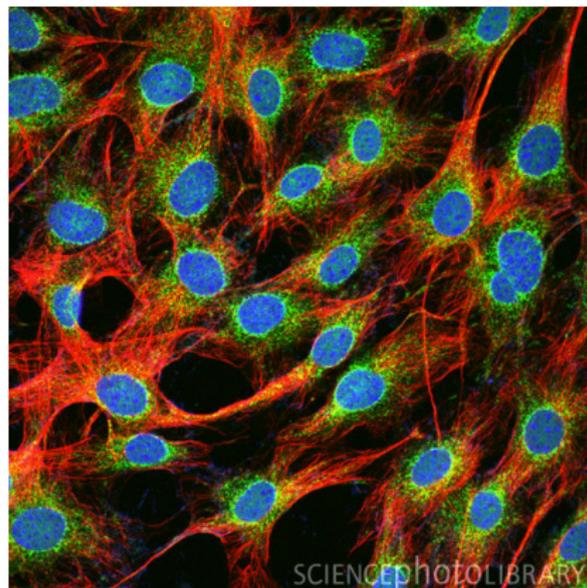
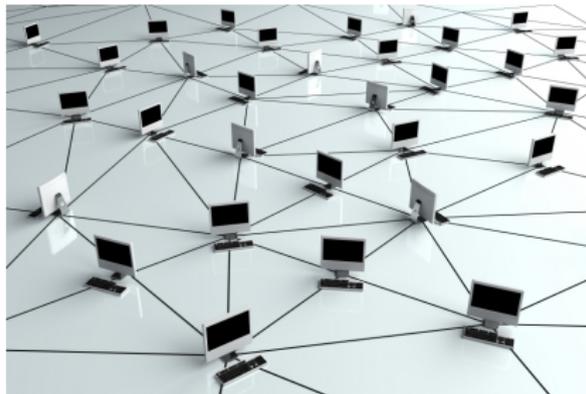
The 1st Workshop on Biological Distributed Algorithms  
Jerusalem, October 2013

Distributed **network** algorithms

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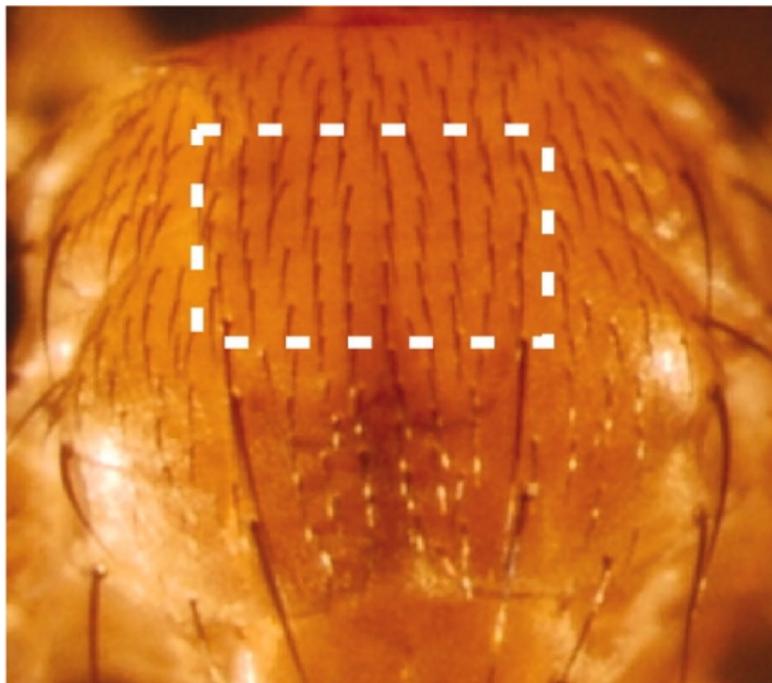
## Distributed **network** algorithms



**Mission:** theory of distributed computing in **biological cellular networks**

# Motivation

Selection of sensory organ precursor (SOP) cells = solving MIS  
[Afek, Alon, Barad, Hornstein, Barkai, Bar-Joseph 11]

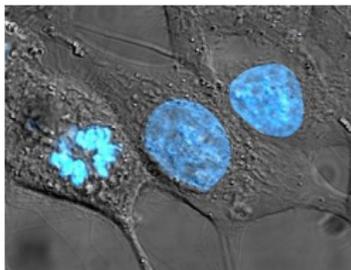


- 1 Cells as computing devices
- 2 Abstract distributed computing models
- 3 Networked finite state machines
- 4 Results
  - MIS algorithm
- 5 Conclusions

# Local computation

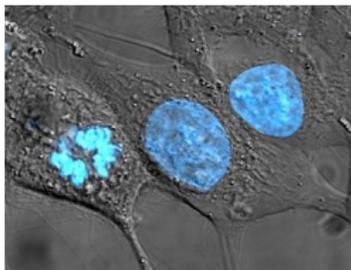
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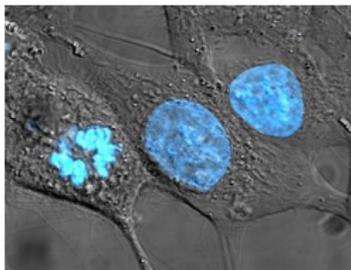


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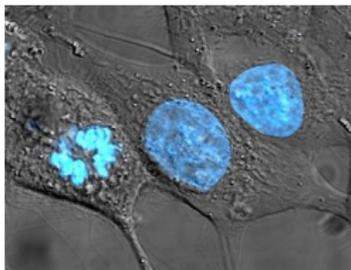


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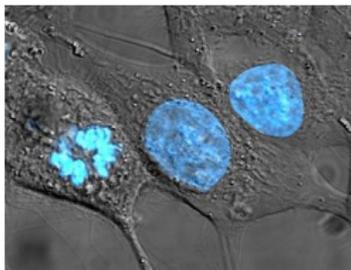


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  - transcribed to RNA molecules

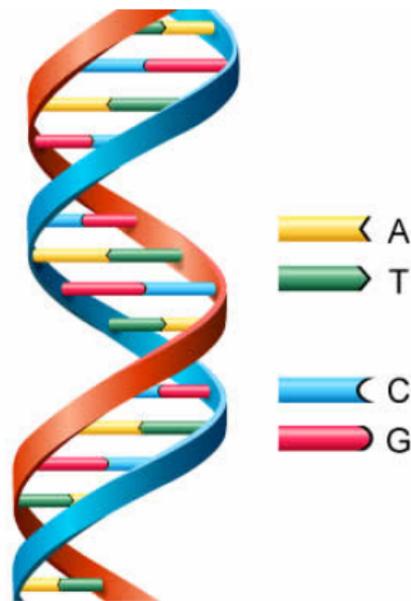


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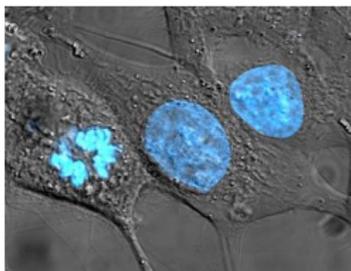


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  - Analogous to CPU's current **state**





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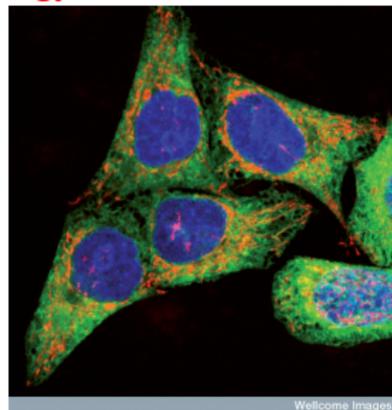
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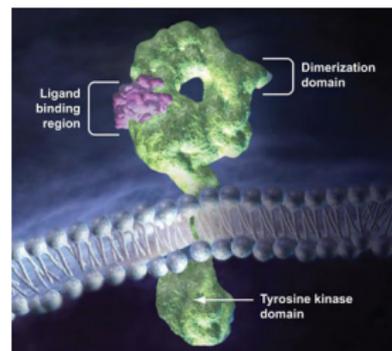
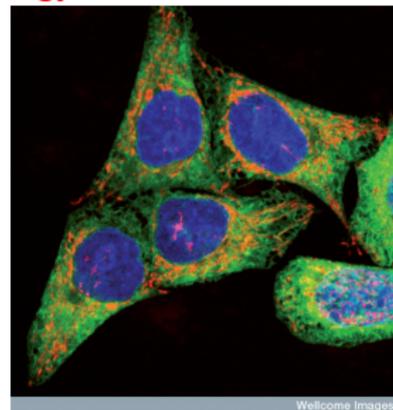


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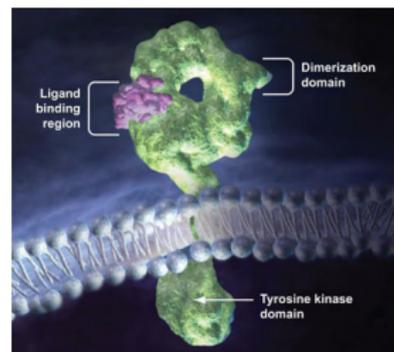
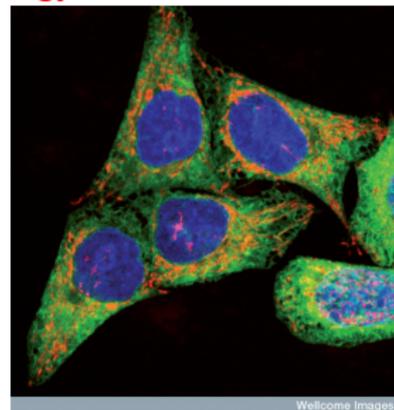


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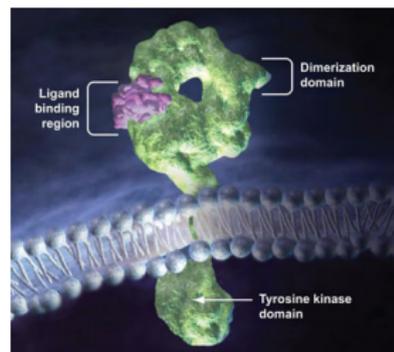
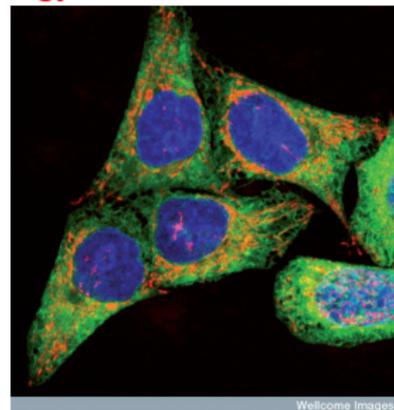


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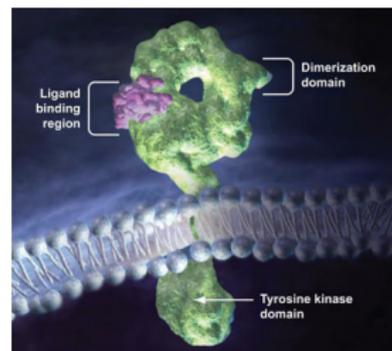
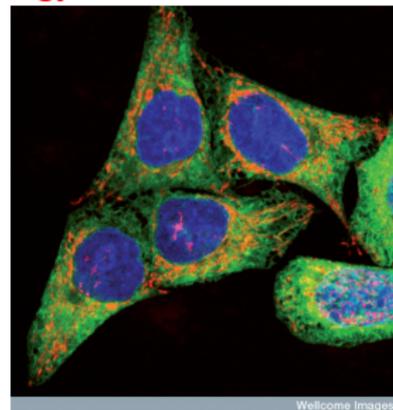


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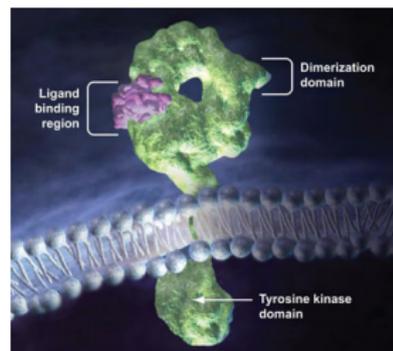
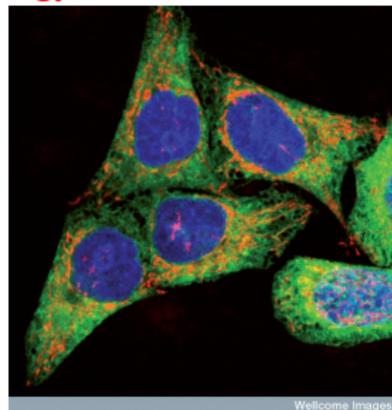


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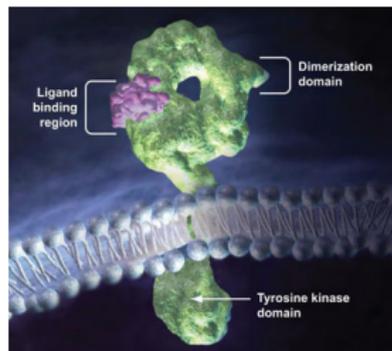
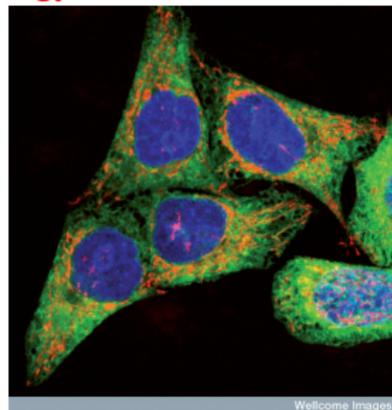


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  - No sense of direction
    - all **neighbors** look the same

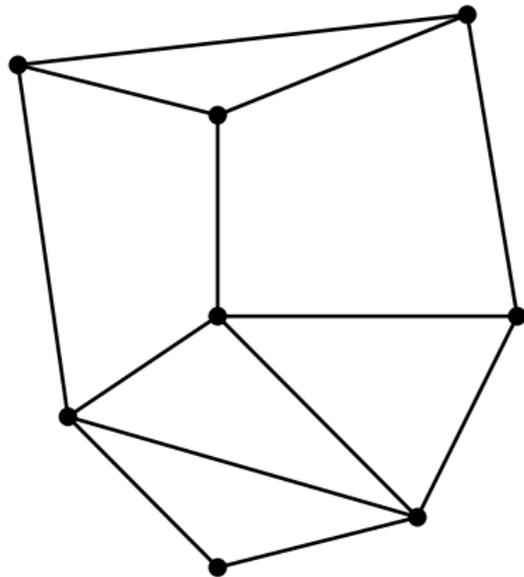


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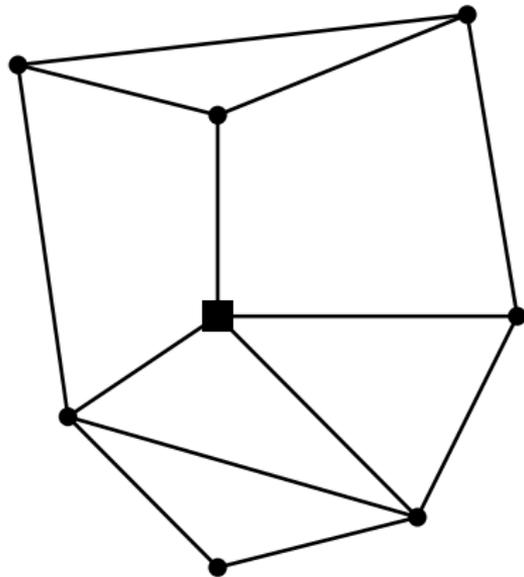
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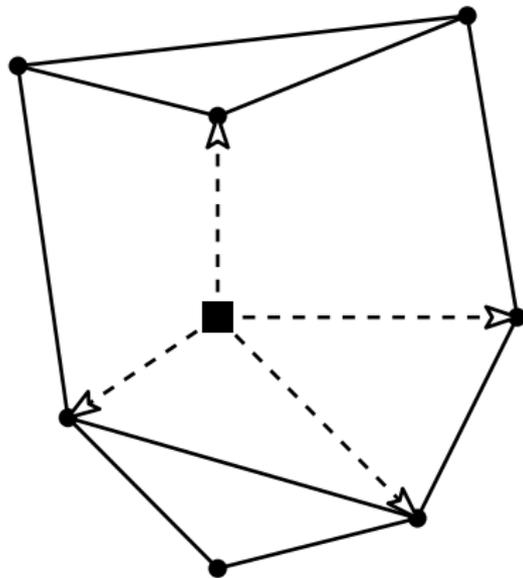


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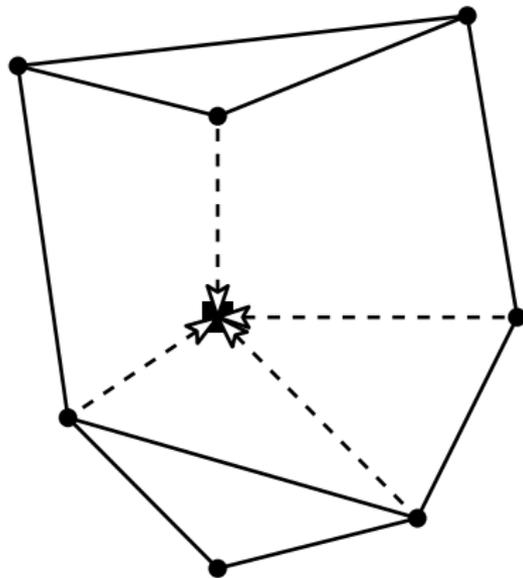


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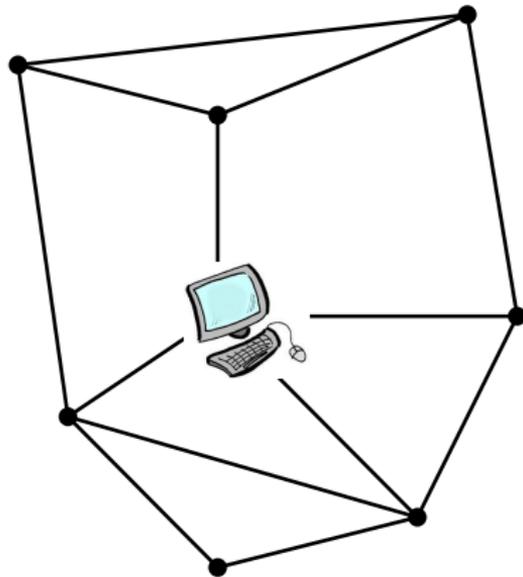


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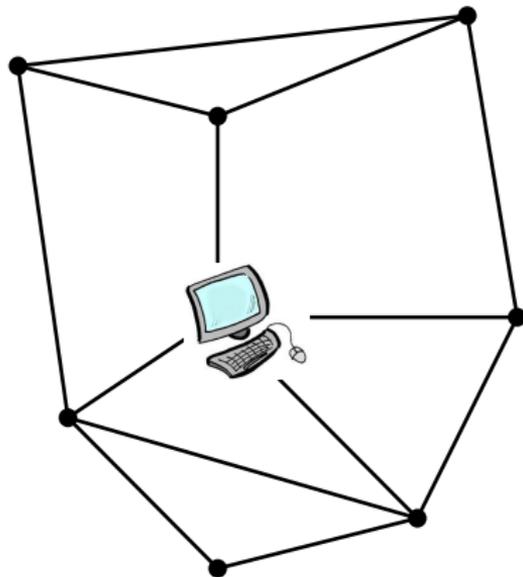


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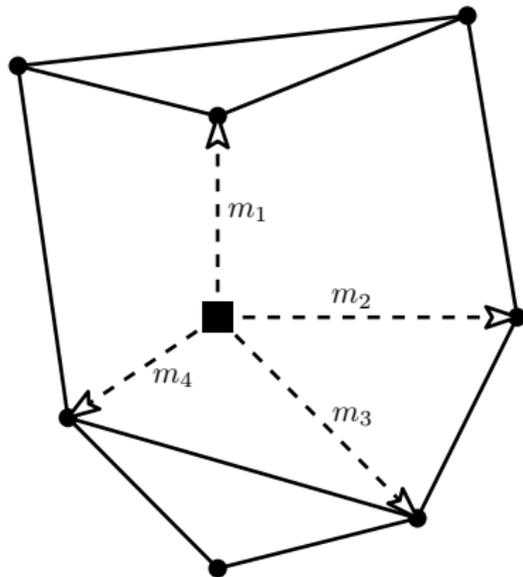
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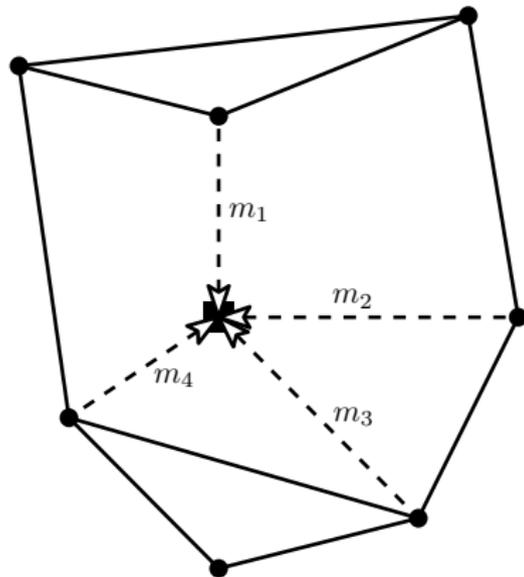
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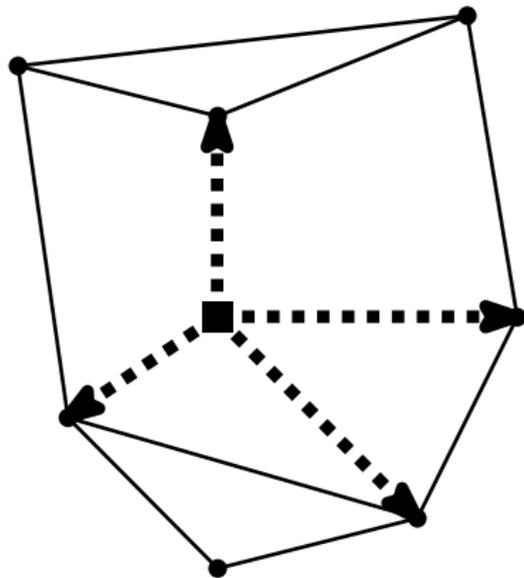
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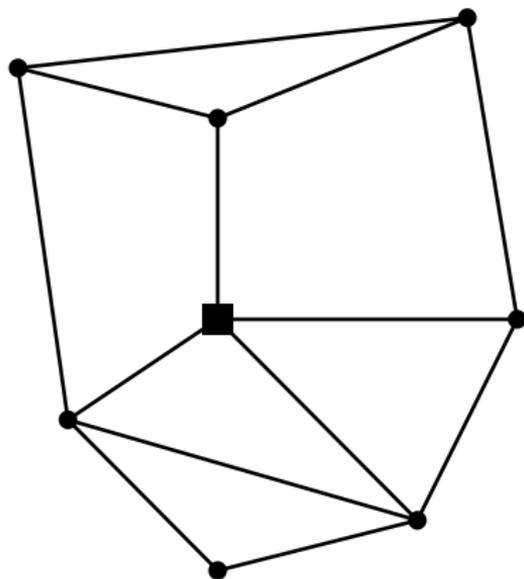


## Communication too strong

- independent messages to/from each neighbor
- # message types grows with  $n$

# The beeping model

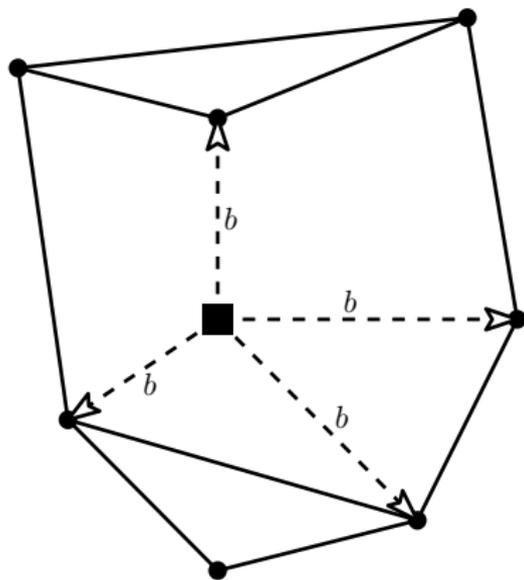
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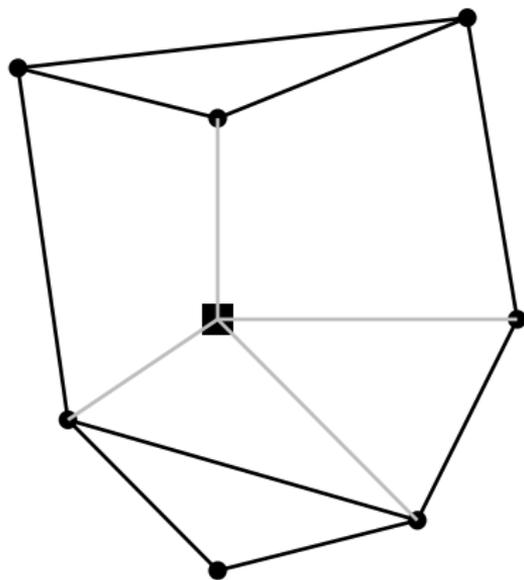


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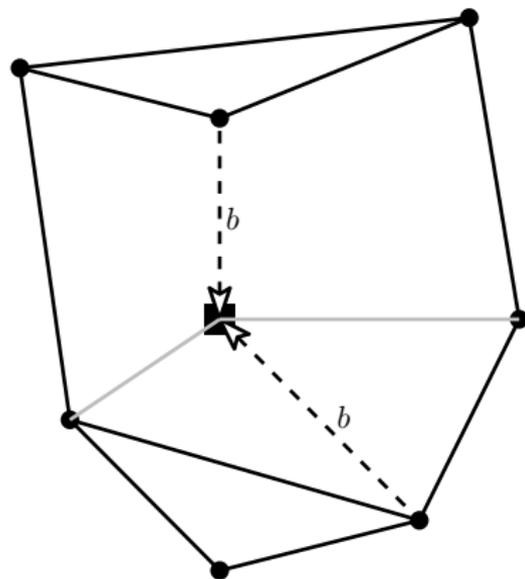


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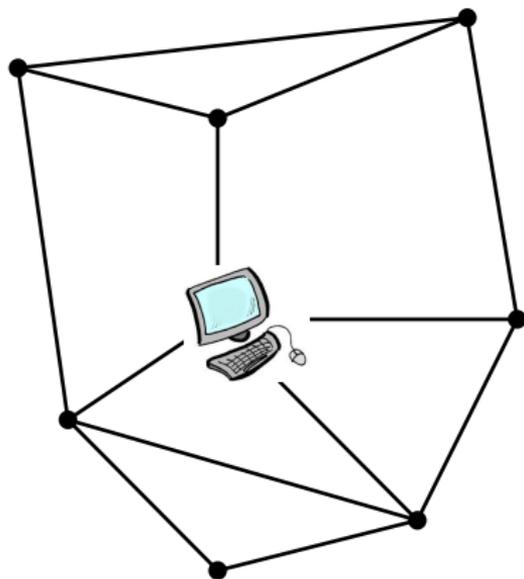


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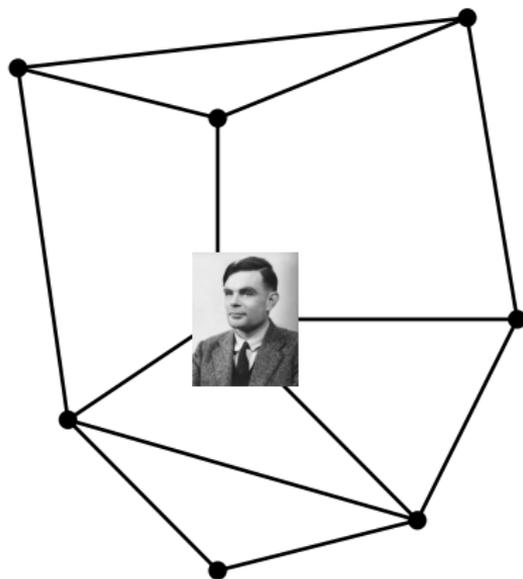
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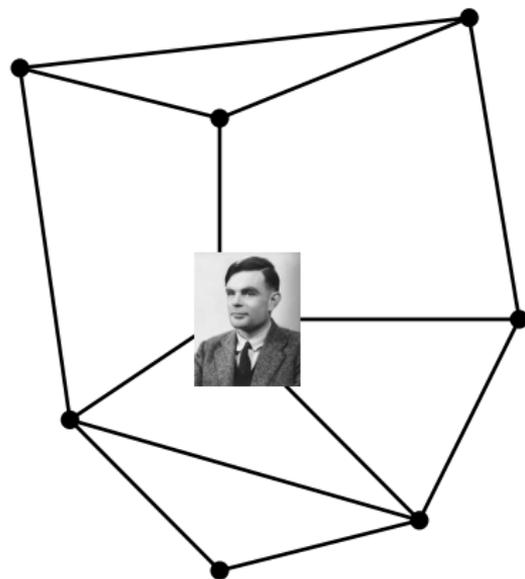
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Perhaps we should aim for a **network of FSMs**?

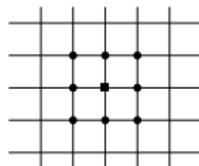
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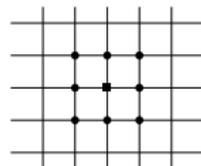
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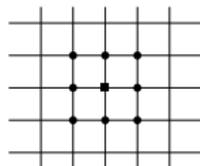


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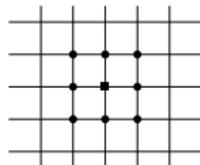


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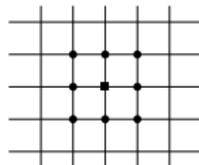
Game of life



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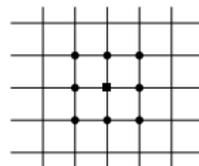
Digital physics



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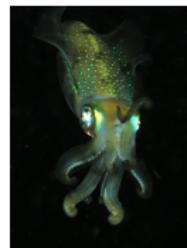
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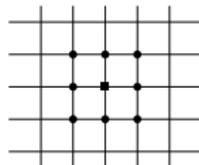
Biological processes



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**Highly regular topology**

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  - one-two-many counting = **discrete analogue** for detecting different concentration levels

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- **Maximal Matching** in arbitrary graphs (small model modification)
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### Theorem (Synchronizer)

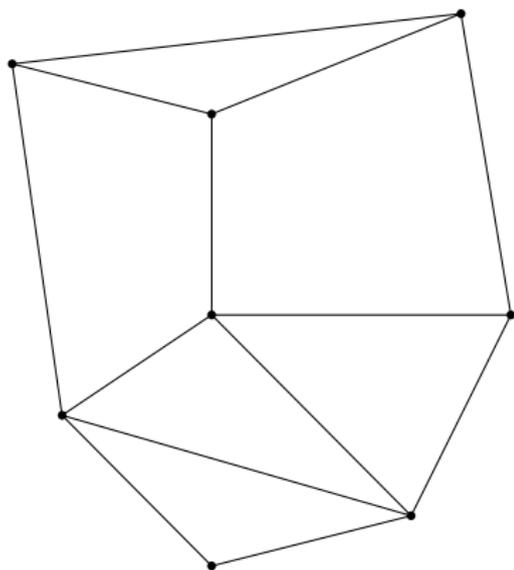
*Every  $n$ FSM algorithm designed to operate in a **synchronous** environment can be simulated in an **asynchronous** environment with a **constant** multiplicative run-time overhead.*

### Theorem (Computability)

*In terms of their computational power,  $n$ FSM algorithms are (almost) equivalent to randomized **linear-space** Turing machines.*

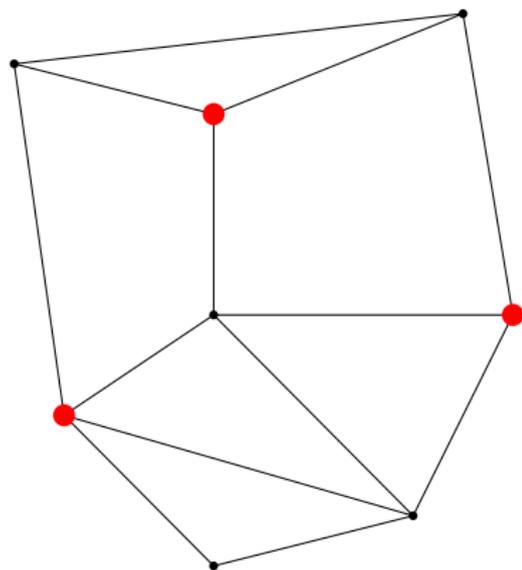
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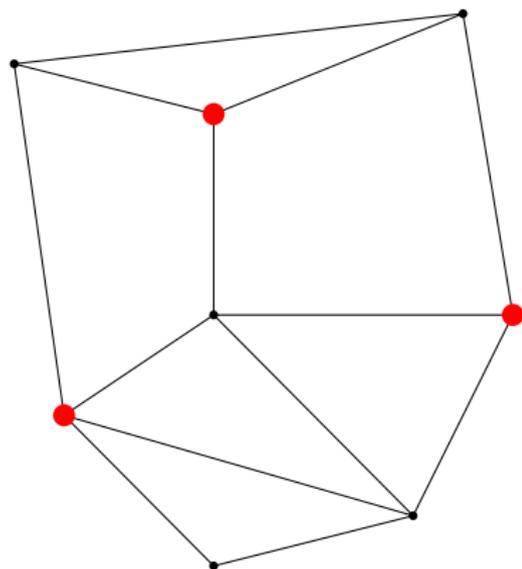
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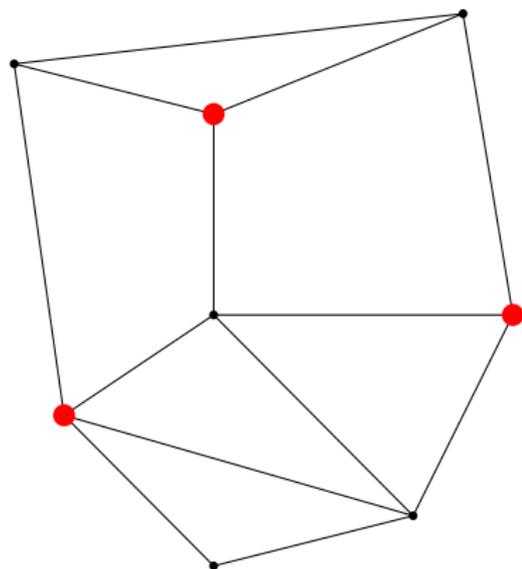
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The MIS problem:

input: (arbitrary) network

output: MIS



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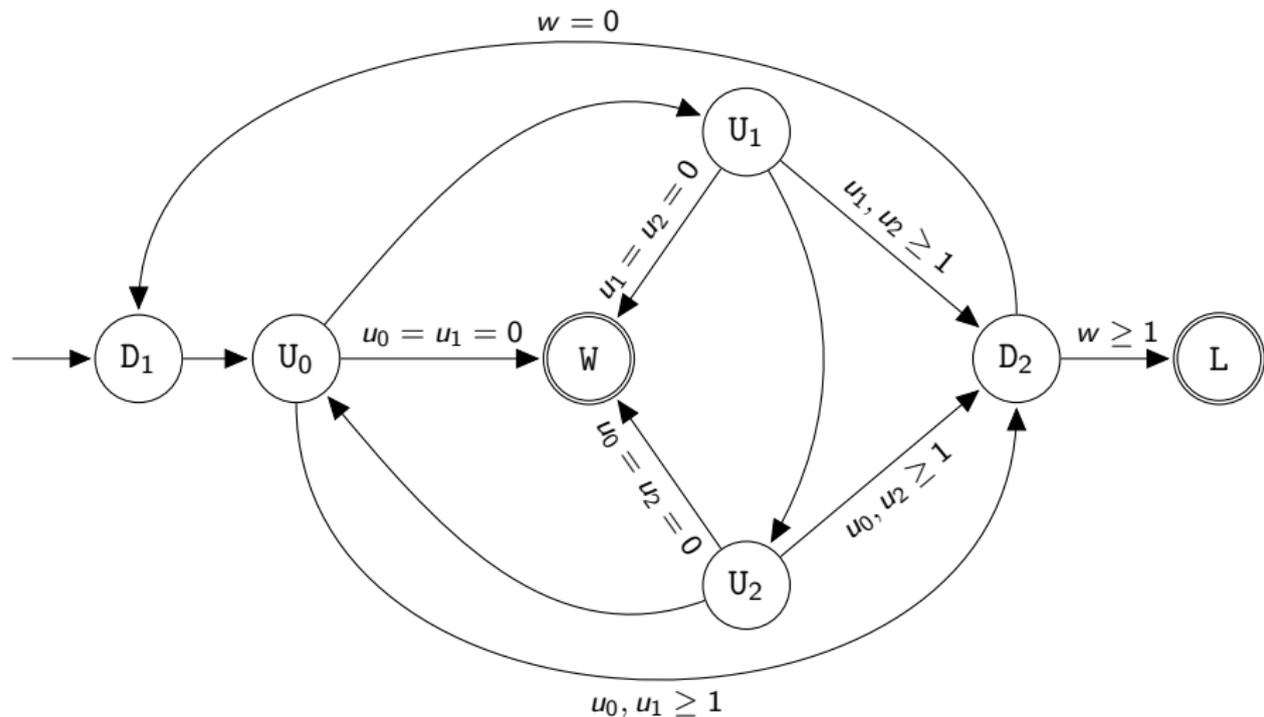
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# MIS under nFSM — solution



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**const** fraction of the edges is removed with **const** probability  $\implies$   
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