

# Formal Analysis of Population Protocols

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**Population protocols:** distributed computing model for massive networks of passively mobile finite-state agents

# Overview



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Can model e.g. networks of passively **mobile sensors** and **chemical reaction networks**

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Protocols **compute predicates** of the form  $\varphi: \mathbb{N}^d \rightarrow \{0, 1\}$   
e.g. if  $\varphi$  is unary, then  $\varphi(n)$  is computed by  $n$  agents

# Overview

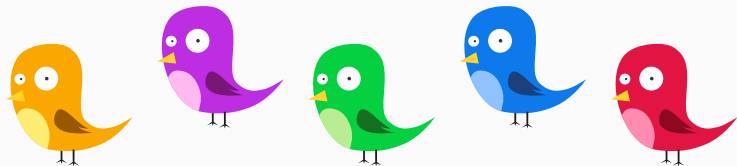


**Population protocols:** distributed computing model for massive networks of passively mobile finite-state agents

**This talk:** overview of recent advances on the formal analysis of population protocols

- anonymous mobile agents with very few resources
- agents change states via random pairwise interactions
- each agent has opinion true/false
- computes by stabilizing agents to some opinion

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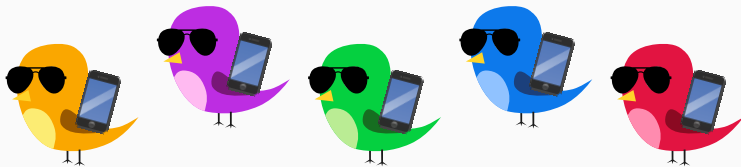


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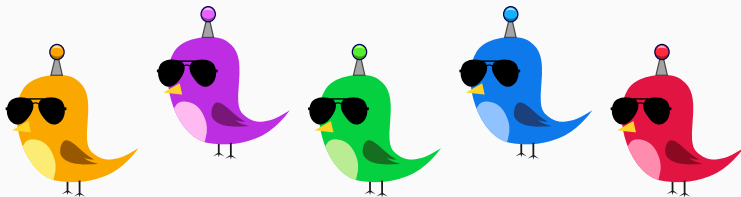




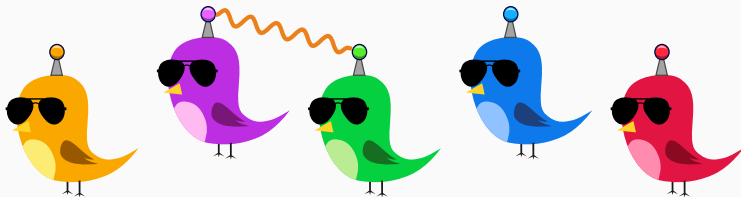
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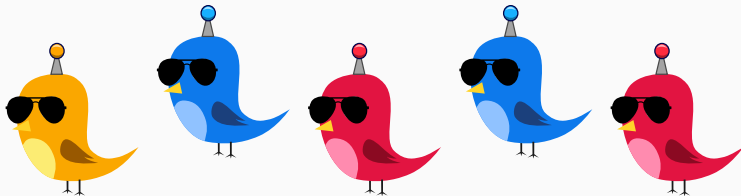
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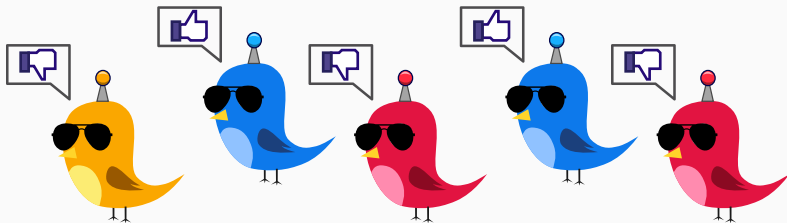
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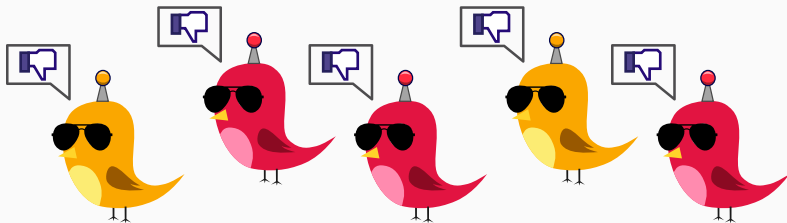
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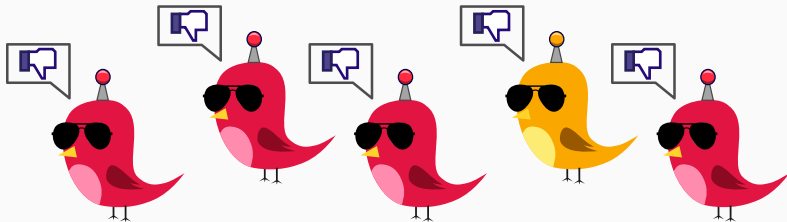
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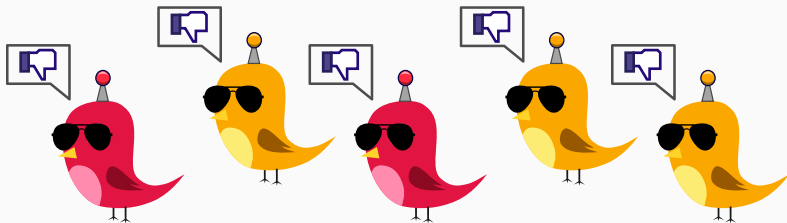
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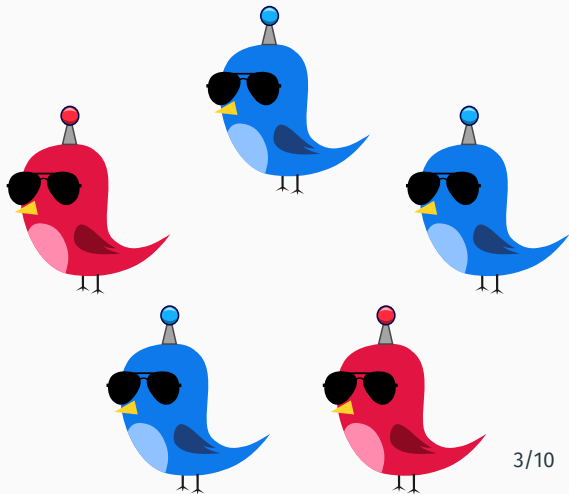
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## Example: majority protocol

At least as many **blue birds** than **red birds**?

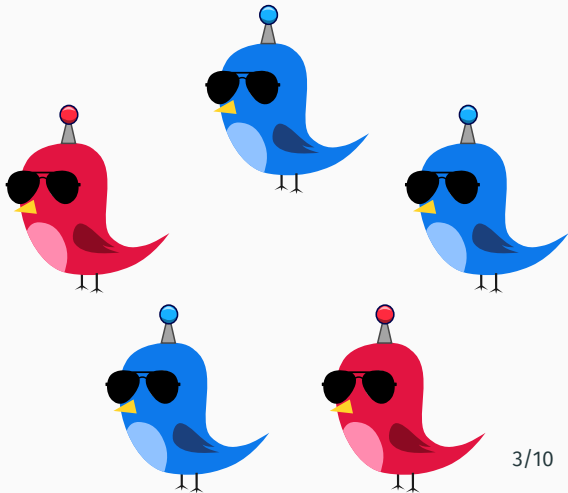


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- Two large birds of different colors become small and blue
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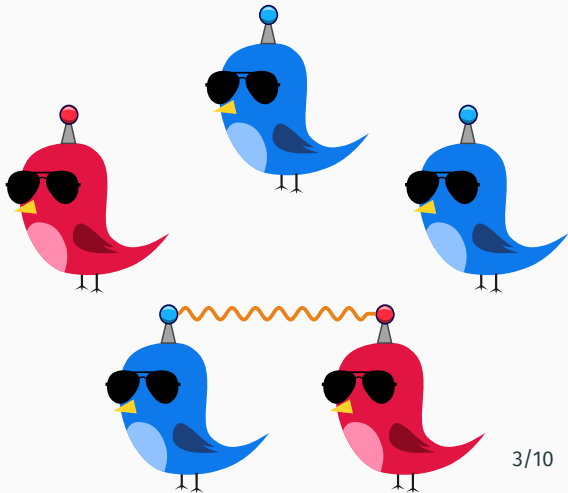


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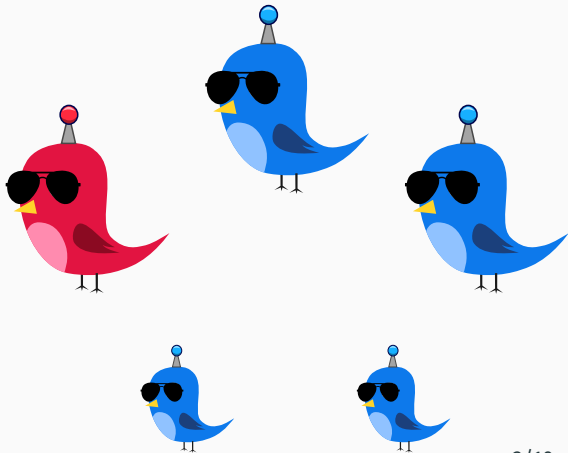


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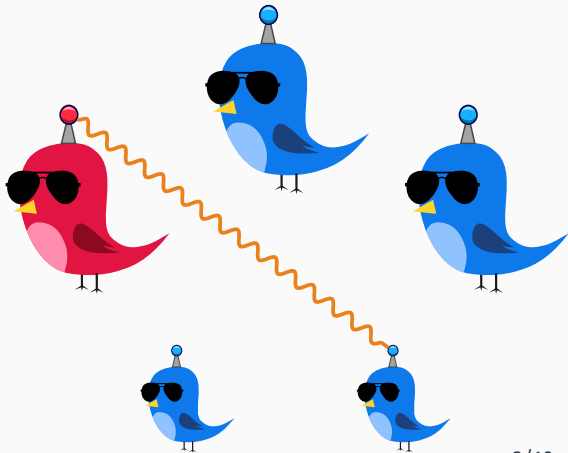


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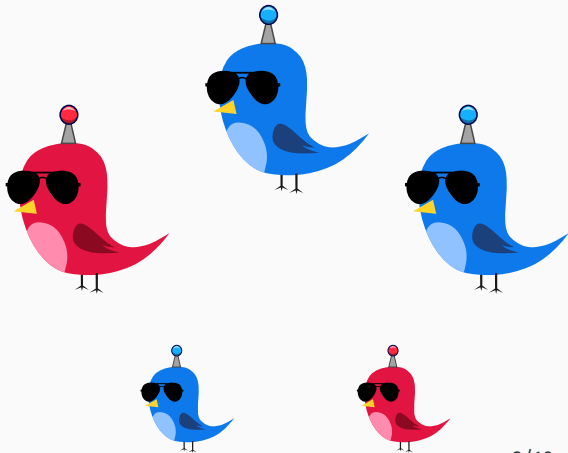


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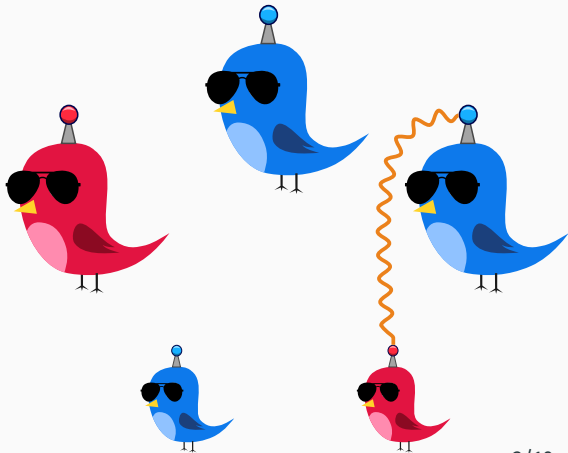


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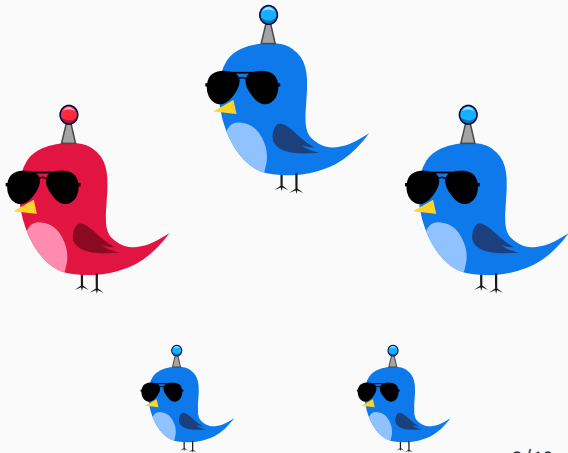


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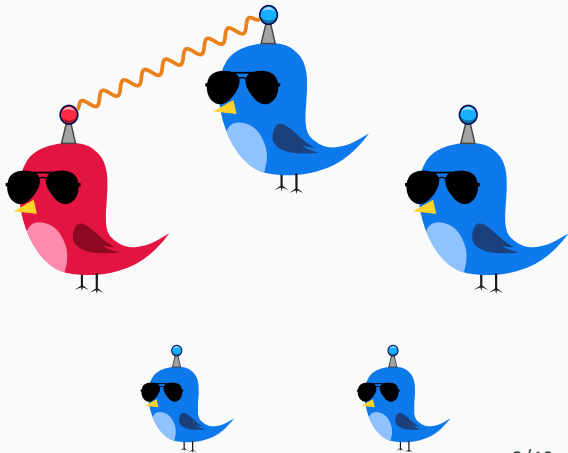


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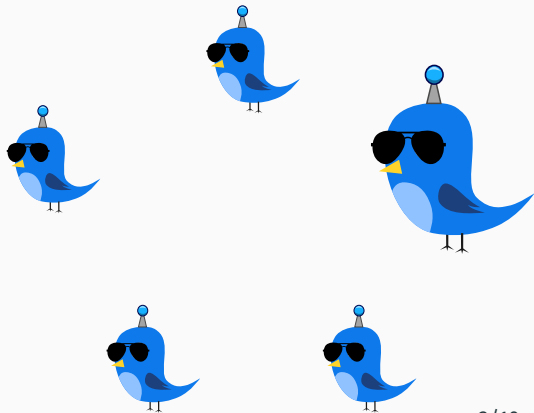


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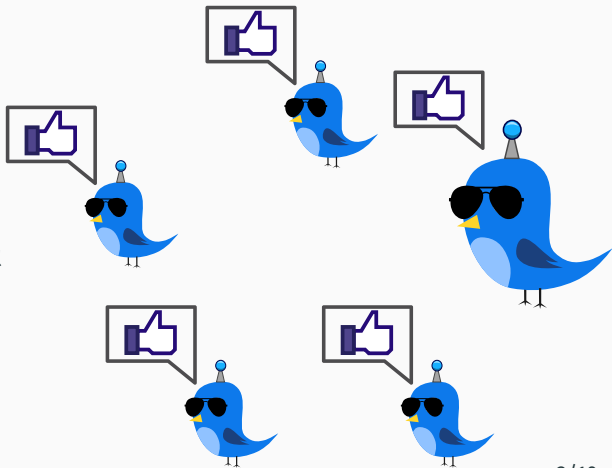


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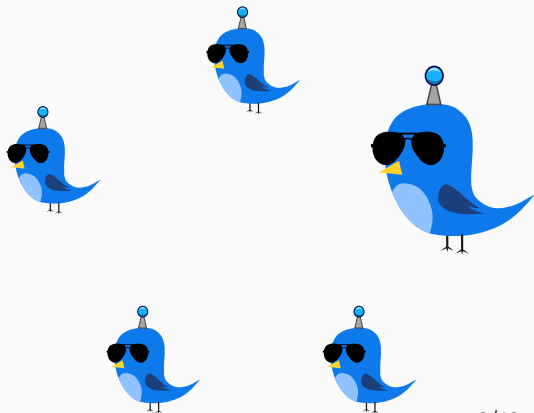


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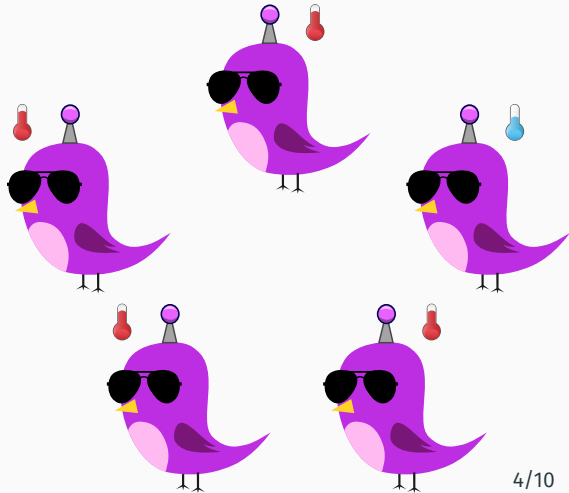
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- **To break ties:** small blue birds convert small red birds



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Are there at least 4 sick birds?

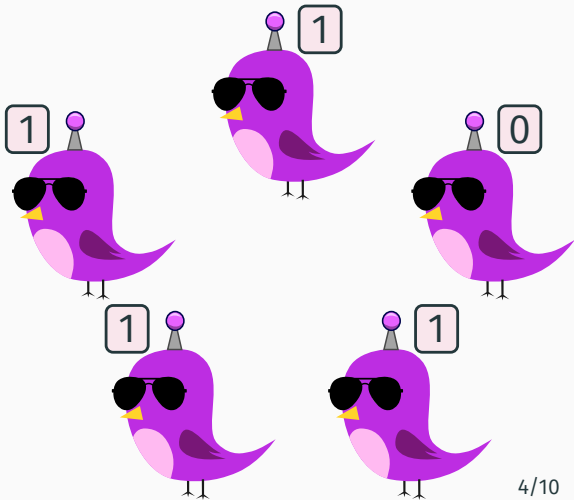


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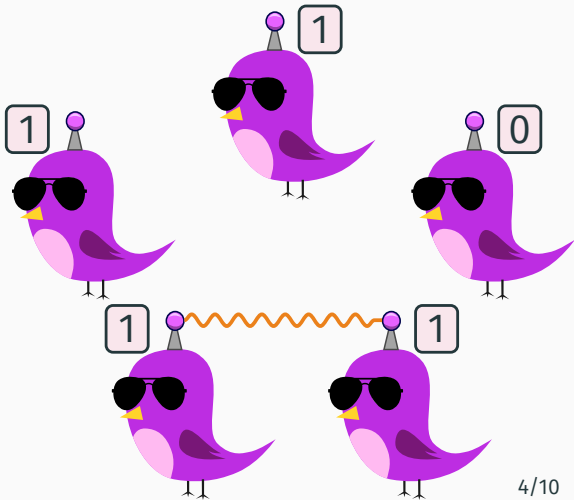


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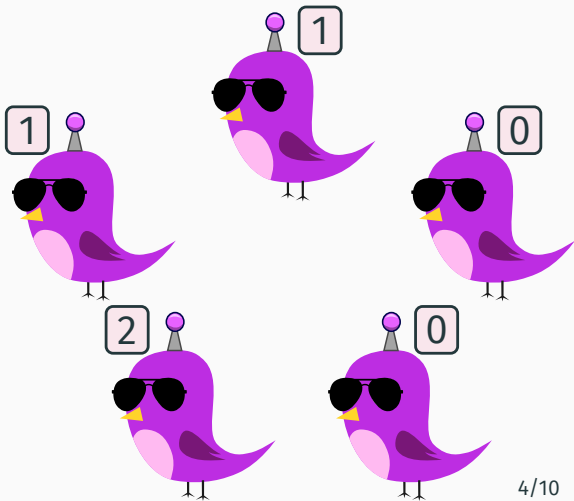


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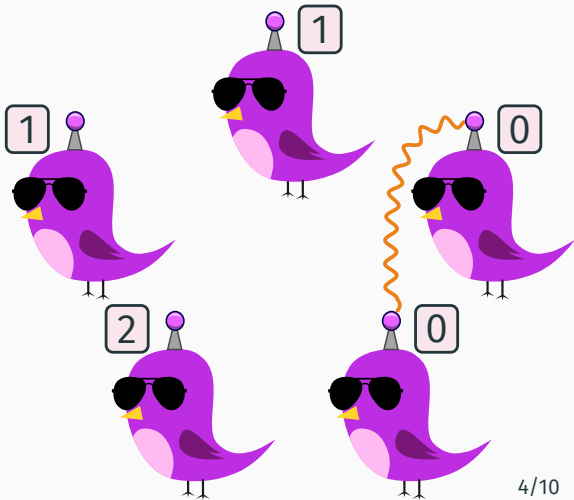


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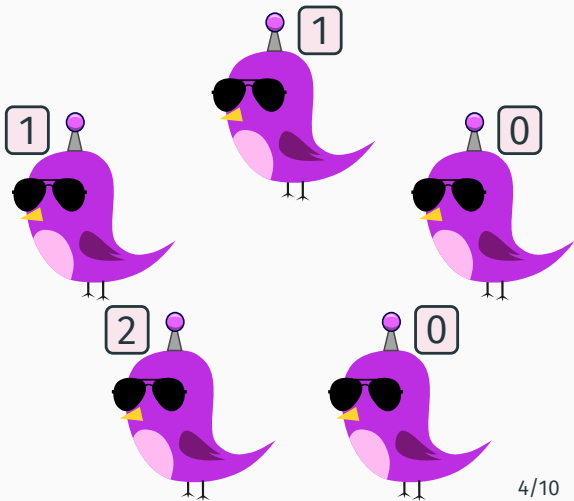


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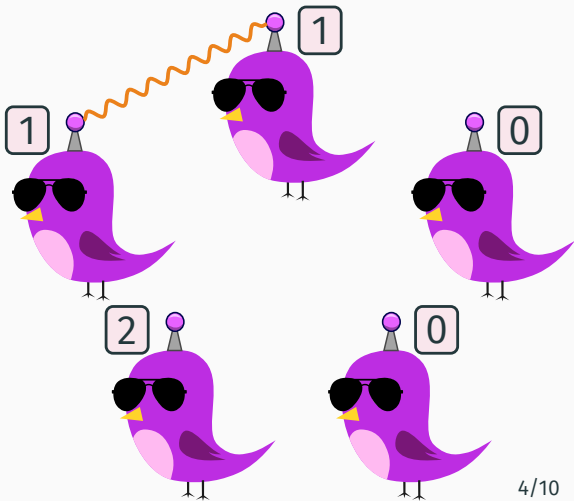


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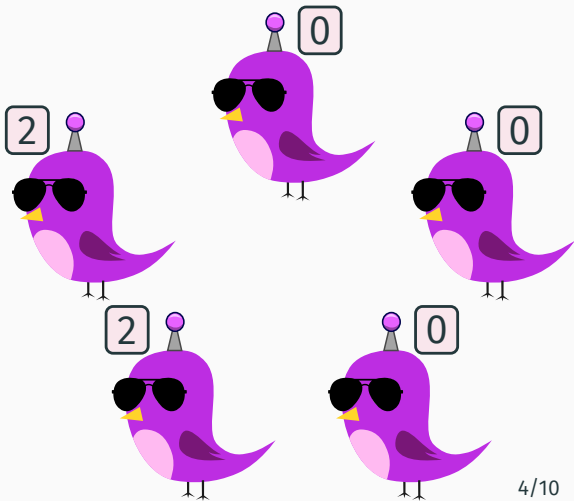


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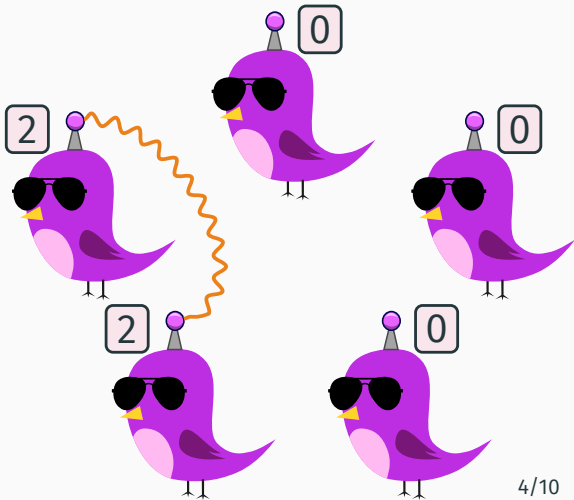


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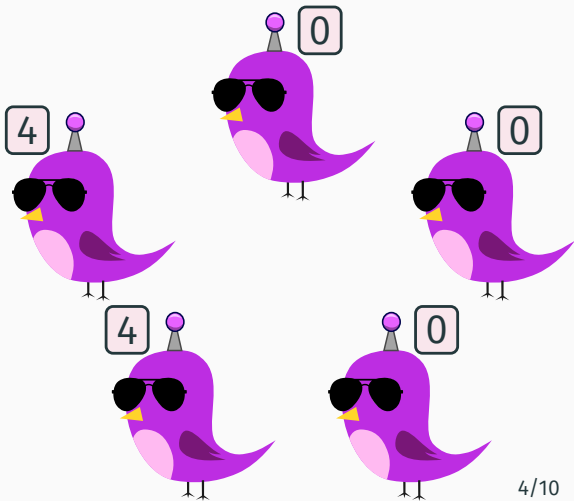


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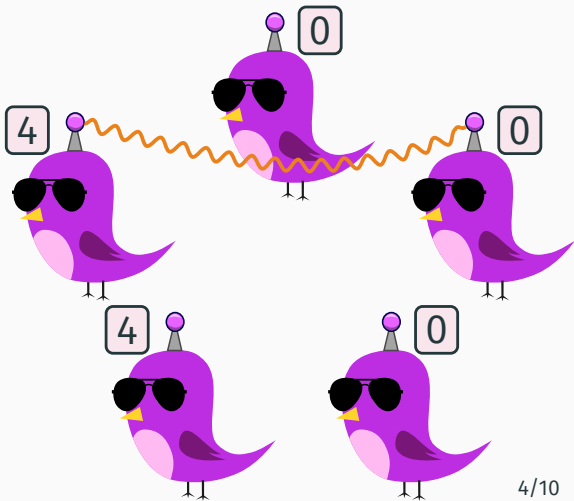


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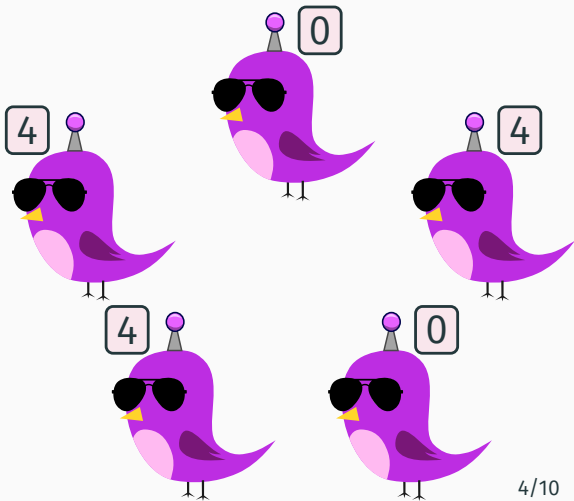


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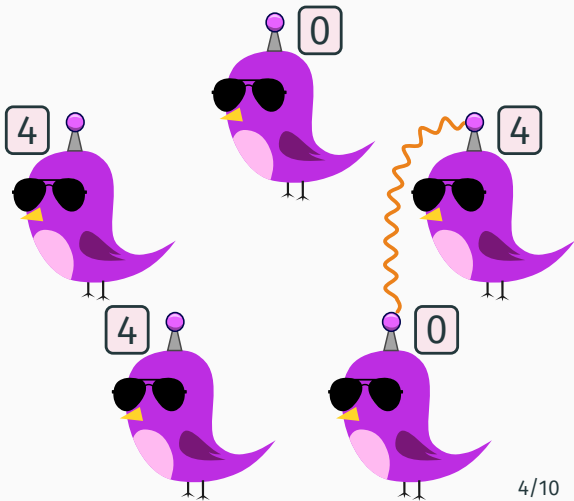


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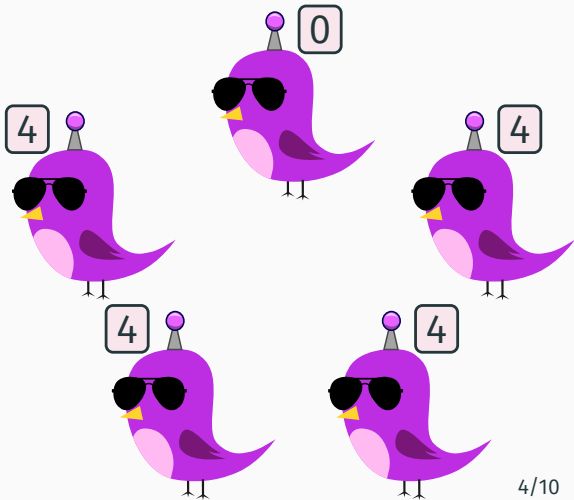


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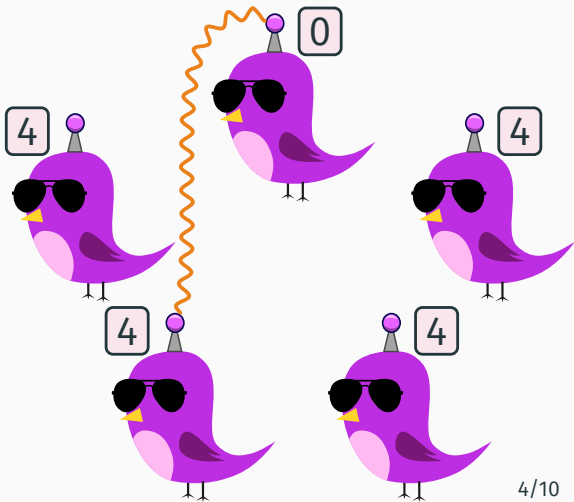


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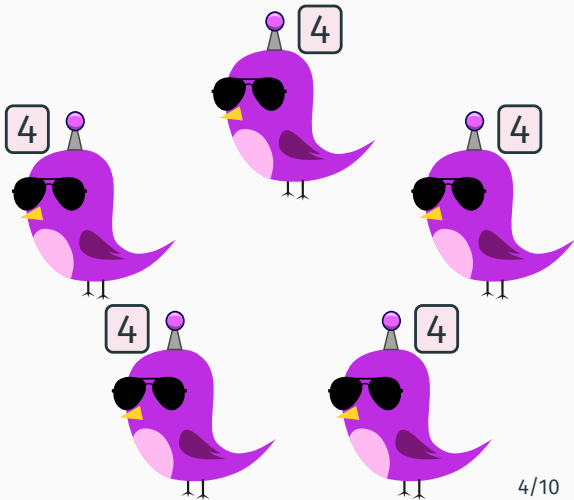


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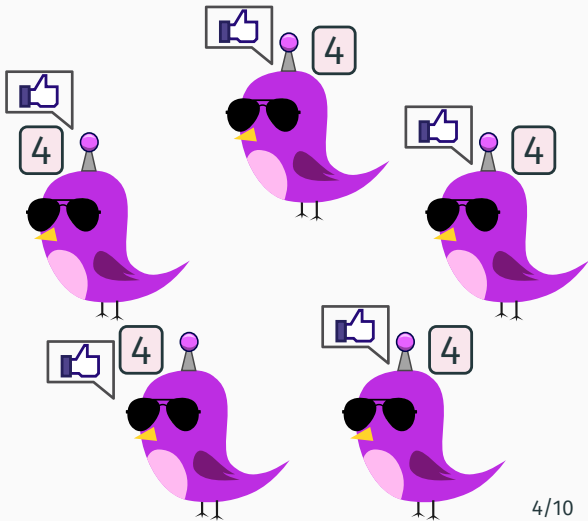


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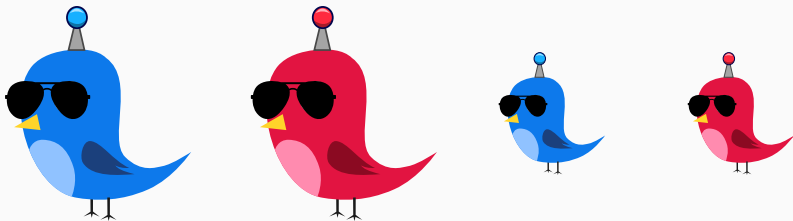
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# Demonstration

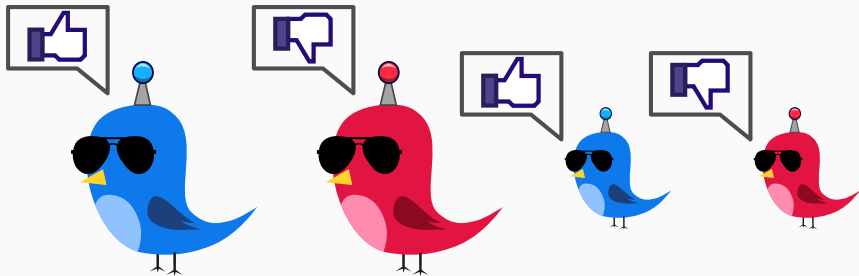
# Population protocols: formal model

- *States:* finite set  $Q$
- *Opinions:*  $O : Q \rightarrow \{0, 1\}$
- *Initial states:*  $I \subseteq Q$
- *Transitions:*  $T \subseteq Q^2 \times Q^2$



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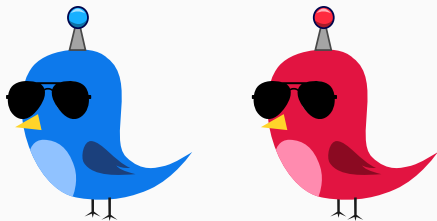
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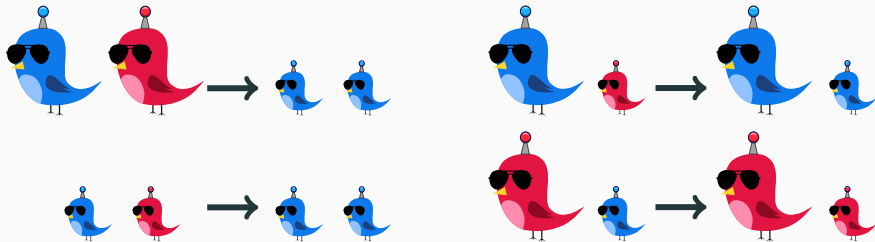
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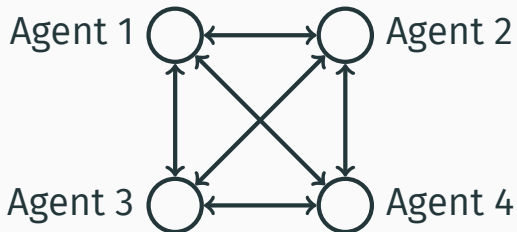


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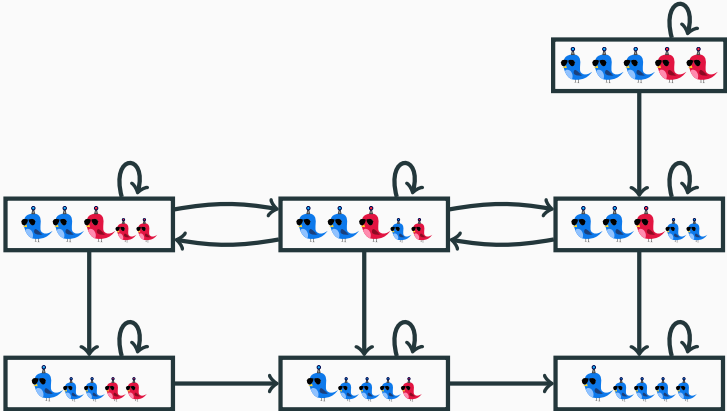


## Interaction graph:



# Population protocols: computations

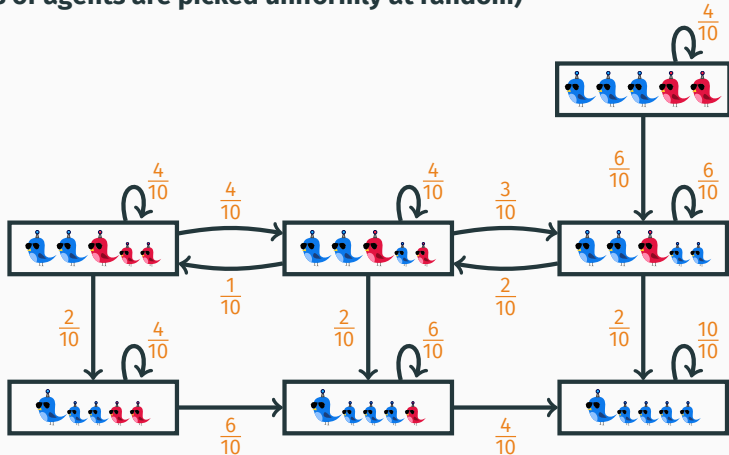
## Reachability graph:



# Population protocols: computations

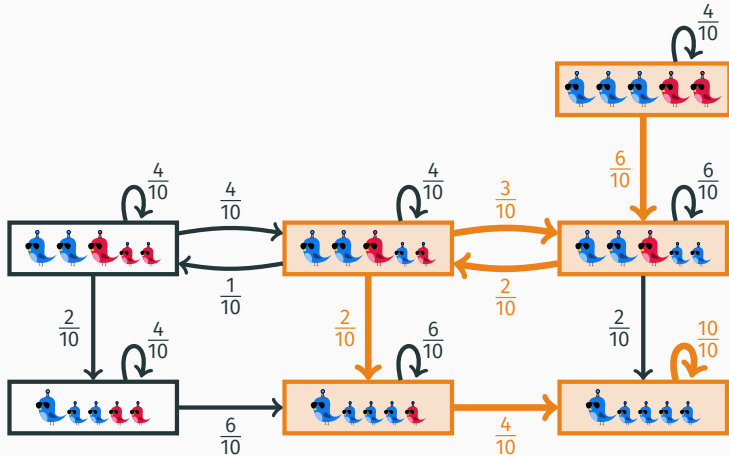
## Underlying Markov chain:

(pairs of agents are picked uniformly at random)



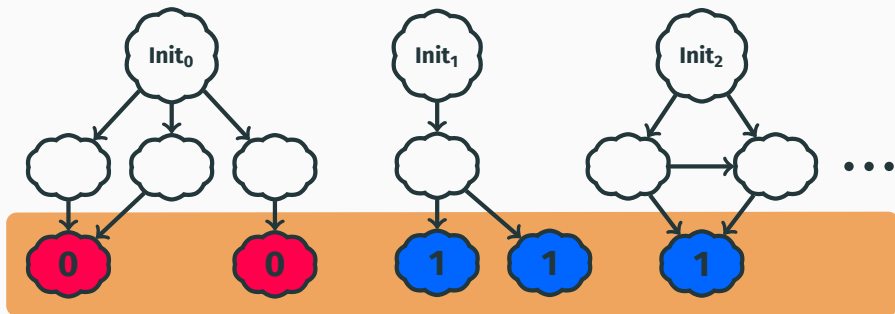
# Population protocols: computations

**A run is an infinite path:**



## Population protocols: computations

A protocol computes a predicate  $\varphi: \mathbb{N}^I \rightarrow \{0, 1\}$   
if runs reach **common stable consensus**  
with probability 1



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### **Expressive power**

Angluin, Aspnes, Eisenstat PODC'06

Population protocols compute precisely predicates definable in Presburger arithmetic, *i.e.*  $\text{FO}(\mathbb{N}, +, <)$



## Other variants considered:

- Approximate protocols *e.g.* Angluin, Aspnes, Eisenstat DISC'07
- Protocols with leaders Angluin, Aspnes, Eisenstat Dist. Comput.'08
- Protocols with failures Delporte-Gallet *et al.* DCOSS'06
- Trustful protocols Bournez, Lefevre, Rabie DISC'13
- Mediated protocols, etc. Michail, Chatzigiannakis, Spirakis TCS'11

### **Expressive power**

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## Protocols can become complex, even for $B \geq R$ :

### Fast and Exact Majority in Population Protocols

Dan Alistarh  
Microsoft Research

Rati Gelashvili<sup>\*</sup>  
MIT

Milan Vojnović  
Microsoft Research

```
1  $weight(x) = \begin{cases} |x| & \text{if } x \in StrongStates \text{ or } x \in WeakStates; \\ 1 & \text{if } x \in IntermediateStates. \end{cases}$ 
2  $sgn(x) = \begin{cases} 1 & \text{if } x \in \{+0, 1_d, \dots, 1_1, 3, 5, \dots, m\}; \\ -1 & \text{otherwise.} \end{cases}$ 
3  $value(x) = sgn(x) \cdot weight(x)$ 
4 /* Functions for rounding state interactions */
4  $\phi(x) = -1_1$  if  $x = -1$ ;  $1_1$  if  $x = 1$ ;  $x$ , otherwise
5  $R_\downarrow(k) = \phi(k)$  if  $k$  odd integer,  $k - 1$  if  $k$  even)
6  $R_\uparrow(k) = \phi(k)$  if  $k$  odd integer,  $k + 1$  if  $k$  even)
7  $Shift\text{-}to\text{-}Zero(x) = \begin{cases} -1_{j+1} & \text{if } x = -1_j \text{ for some index } j < d \\ 1_{j+1} & \text{if } x = 1_j \text{ for some index } j < d \\ x & \text{otherwise.} \end{cases}$ 
8  $Sign\text{-}to\text{-}Zero(x) = \begin{cases} +0 & \text{if } sgn(x) > 0 \\ -0 & \text{otherwise.} \end{cases}$ 
9 procedure update( $x, y$ )
10 if ( $weight(x) > 0$  and  $weight(y) > 1$ ) or ( $weight(y) > 0$  and  $weight(x) > 1$ ) then
11  $x' \leftarrow R_\downarrow\left(\frac{value(x)+value(y)}{2}\right)$  and  $y' \leftarrow R_\uparrow\left(\frac{value(x)+value(y)}{2}\right)$ 
12 else if  $weight(x) \cdot weight(y) = 0$  and  $value(x) + value(y) > 0$  then
13 if  $weight(x) \neq 0$  then  $x' \leftarrow Shift\text{-}to\text{-}Zero(x)$  and  $y' \leftarrow Sign\text{-}to\text{-}Zero(x)$ 
14 else  $y' \leftarrow Shift\text{-}to\text{-}Zero(y)$  and  $x' \leftarrow Sign\text{-}to\text{-}Zero(y)$ 
15 else if ( $x \in \{-1_d, +1_d\}$  and  $weight(y) = 1$  and  $sgn(x) \neq sgn(y)$ ) or
16 ( $y \in \{-1_d, +1_d\}$  and  $weight(x) = 1$  and  $sgn(y) \neq sgn(x)$ ) then
17  $x' \leftarrow -0$  and  $y' \leftarrow +0$ 
18 else
19  $x' \leftarrow Shift\text{-}to\text{-}Zero(x)$  and  $y' \leftarrow Shift\text{-}to\text{-}Zero(y)$ 
```

## Protocols can become complex, even for $B \geq R$ :

### Fast and Exact Majority in Population Protocols

Dan Alistarh  
Microsoft Research

Rati Gelashvili<sup>\*</sup>  
MIT

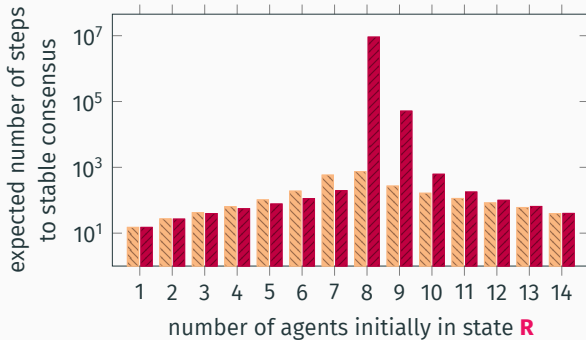
Milan Vojnović  
Microsoft Research

```
1  $weight(x) = \begin{cases} |x| & \text{if } x \in StrongStates \text{ or } x \in WeakStates; \\ 1 & \text{if } x \in IntermediateStates. \end{cases}$ 
2  $sgn(x) = \begin{cases} 1 & \text{if } x \in \{+0, 1_d, \dots, 1_1, 3, 5, \dots, m\}; \\ -1 & \text{otherwise.} \end{cases}$ 
3  $value(x) = sgn(x) \cdot weight(x)$ 
4 /* Functions for rounding state interactions */
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10 procedure update( $x, y$ )
11   if ( $weight(x) > 0$  and  $weight(y) > 1$ ) or ( $weight(y) > 0$  and  $weight(x) > 1$ ) then
12      $x' \leftarrow R_d\left(\frac{value(x)+value(y)}{2}\right)$  and  $y' \leftarrow R_t\left(\frac{value(x)+value(y)}{2}\right)$ 
13   else if  $weight(x) \cdot weight(y) = 0$  and  $value(x) + value(y) > 0$  then
14     if  $weight(x) \neq 0$  then  $x' \leftarrow Shift\text{-}to\text{-}Zero(x)$  and  $y' \leftarrow Sign\text{-}to\text{-}Zero(x)$ 
15     else  $y' \leftarrow Shift\text{-}to\text{-}Zero(y)$  and  $x' \leftarrow Sign\text{-}to\text{-}Zero(y)$ 
16   else if ( $x \in \{-1_d, +1_d\}$  and  $weight(y) = 1$  and  $sgn(x) \neq sgn(y)$ ) or
17     ( $y \in \{-1_d, +1_d\}$  and  $weight(x) = 1$  and  $sgn(y) \neq sgn(x)$ ) then
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19   else
20      $x' \leftarrow Shift\text{-}to\text{-}Zero(x)$  and  $y' \leftarrow Shift\text{-}to\text{-}Zero(y)$ 
```

How to verify  
correctness  
automatically?

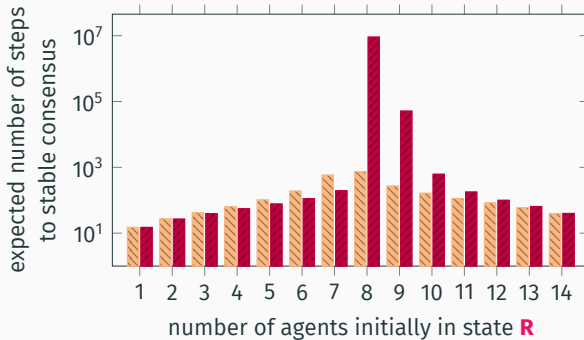
# Formal analysis of protocols

**Convergence speed may vary wildly,  
challenging to establish bounds**



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**Convergence speed may vary wildly,  
challenging to establish bounds**



*How to derive asymptotic bounds  
automatically?*

# Formal analysis of protocols

**Number of states corresponds to amount of memory, relevant to keep it minimal for embedded systems**

- **B**  $\geq$  **R** requires at least 4 states (Mertzios *et al.* ICALP'14)
- **X**  $\geq$  **C** requires at most  $c + 1$  states

## Formal analysis of protocols

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What is the state complexity of common predicates?

# Formal analysis of protocols

## 1. Automatic verification of correctness

- Decidability Esparza, Ganty, Leroux, Majumdar CONCUR'15, FSTTCS'16
- Towards efficient verification B., Esparza, Jaax, Meyer PODC'17
- Complete tool B., Esparza, Jaax CAV'18

## 2. Automatic analysis of convergence speed

- First procedure B., Esparza, Kučera (submitted to CONCUR'18)

## 3. State complexity of protocols w.r.t. predicates

- Study of linear inequalities B., Esparza, Jaax STACS'18



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## Existing verification tools:

- PAT: model checker with global fairness  
(Sun, Liu, Song Dong and Pang CAV'09)
- bp-ver: graph exploration  
(Chatzigiannakis, Michail and Spirakis SSS'10)
- Conversion to counter machines + PRISM/Spin  
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*Only for populations of fixed size!*

### **Sometimes possible to verify all sizes:**

- Verification with the interactive theorem prover Coq  
(Deng and Monin TASE'09)

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*Not automatic!*

### Sometimes possible to verify all sizes:

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Challenge: verifying automatically  
all sizes

Testing whether a protocol computes  $\varphi$   
amounts to testing:

$$\neg \exists C, D: \quad C \xrightarrow{*} D \wedge \\ C \text{ is initial} \wedge \\ D \text{ is bottom} \wedge \\ \text{opinion}(D) \neq \varphi(C)$$

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*As difficult as verification*



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*Relaxed with Presburger-definable  
overapproximation*

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*Difficult to express*

Testing whether a protocol computes  $\varphi$   
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$$\neg \exists C, D: \quad C \xrightarrow{*} D \wedge$$

$C$  is initial  $\wedge$   
 $D$  is terminal  $\wedge$   
opinion( $D$ )  $\neq \varphi(C)$

*Most protocols are terminating!*

Testing whether a protocol computes  $\varphi$   
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$$D \text{ is terminal} \wedge$$
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*Testable with an SMT solver*

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$$\neg \exists C, D: \quad C \xrightarrow{*} D \wedge \\ C \text{ is initial} \wedge \\ D \text{ is terminal} \wedge \\ \text{opinion}(D) \neq \varphi(C)$$

Protocol termination tested by  
structural analysis + SMT solving

Random variable *Steps*:

assigns to each run  $\sigma$  the smallest  $k$  s.t.  $\sigma_k$  in stable consensus

### Maximal expected termination time

We are interested in  $time: \mathbb{N} \rightarrow \mathbb{N}$  where

$$time(n) = \max\{\mathbb{E}_C[Steps] : C \text{ is initial and } |C| = n\}$$

## Our approach:

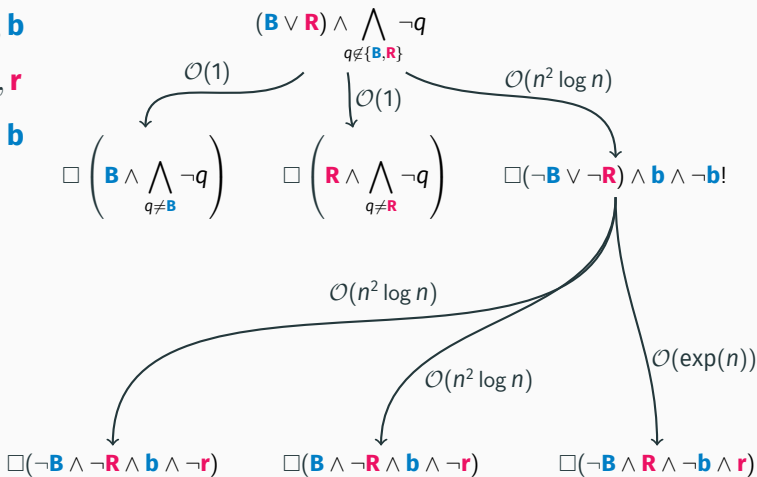
- Most protocols are naturally designed in stages
- Construct these stages automatically
- Derive upper bounds on  $time(n)$   
from stages structure

**B, R**  $\mapsto$  **b, b**


**B, r**  $\mapsto$  **B, b**

**R, b**  $\mapsto$  **R, r**

**b, r**  $\mapsto$  **b, b**





- Prototype implemented in  python™ + Microsoft Z3
- Can report:  $\mathcal{O}(1)$ ,  $\mathcal{O}(n^2)$ ,  $\mathcal{O}(n^2 \log n)$ ,  $\mathcal{O}(n^3)$ ,  $\mathcal{O}(\text{poly}(n))$  or  $\mathcal{O}(\exp(n))$
- Tested on various protocols from the literature

Peregrine:  **Haskell** + Microsoft Z3 + JavaScript

`peregrine.model.in.tum.de`

- Design of protocols
- Manual and automatic simulation
- Statistics of properties such as termination time
- Automatic verification of correctness
- More to come!

# Demonstration

### **Population protocols can be formally analyzed automatically:**

- Verification of correctness
- Analysis of expected termination time
- Tool support!

### **Ongoing investigation of state complexity**

## Conclusion: future work (seeking for PhD students/Postdocs)

### ERC Advanced Grant —

#### **PaVeS: Parameterized Verification and Synthesis**

- Goal: Develop proof and synthesis techniques for distributed algorithms working correctly for an arbitrary number of processes
- PI: Javier Esparza (esparza@in.tum.de), TU Munich
- Start of the project: Sept. 1, 2018
- Start of the PhDs/Postdocs: flexible, from Sept. 1, 2018 to about Sept. 1, 2019

**Thank you!**

**Vielen Dank!**