## State Complexity of Population Protocols

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Joint work with Michael Blondin, Philipp Czerner, Blaise Genest, Roland Guttenberg, Martin Helfrich, Stefan Jaax, and Jérôme Leroux

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## An example: Deaf Black Ninjas in the Dark

- Deaf Black Ninjas meet at a Zen garden in the dark to attack a castle

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- How can they find out?



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If at least 100 ninjas, some ninja eventually collects at least 100 pebbles $\rightarrow$ knows that at least 100 ninjas.

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- Ninjas who know they are at least 100 spread the word.


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## Protocol for: At least 4 ninjas?



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- Initially all ninjas in state 1



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## Population protocols




Population protocols: formal model to describe swarms of mobile agents that interact randomly to decide a property of their initial configuration

Examples of properties: Does the initial configuration ... ...contain at least 100 agents?
...contain more agents in state A than in state B ?

Population protocols: formal model to describe swarms of mobile agents that interact randomly to decide a property of their initial configuration

Since the late 00s: model of natural computation.
Agents $\rightarrow$ atoms/molecules

## Chemical Reaction Networks

$$
\mathrm{CH}_{4}+2 \mathrm{O}_{2} \rightarrow \mathrm{CO}_{2}+2 \mathrm{H}_{2} \mathrm{O}
$$

## An NSF Expedition in Computing (2008-2018)

## Molecular Programming Project

## Computer science and engineering has mastered


complexity for electronic computation - can we do the

Example works


NUPACK
nucleic acid package


Leaderless deterministic chemical reaction networks

gro: the cell programminglanguage

## DNA Implementation of the Approximate Majority algorithm

```
nature
nanotechnology
```

Programmable chemical controllers made
from DNA
Yuan-Jyue Chen, Neil Dalchau, Niranjan Srinivas, Andrew Phillips, Luca Cardelli, David
Soloveichik ${ }^{\text {\& }}$ Georg Seelig


- States:
- Opinions:
- Initial states: $\quad I \subseteq Q$
- Transitions:

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$$
O: Q \rightarrow\{\Omega, \mathbb{\sim}\}
$$

$$
I \subseteq Q
$$

$$
T \subseteq Q^{2} \times Q^{2}
$$



## Population protocols: formal model Angluin, Aspnes et al. PODC'04

- States:
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finite set $Q$
$O: Q \rightarrow\left\{\begin{array}{l}\text { H }\end{array} \boldsymbol{p}\right\}$
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- States:
- Opinions:
- Initial states: $\quad I \subseteq Q$
- Transitions: $\quad T \subseteq Q^{2} \times Q^{2}$
- Configurations:
$Q \rightarrow \mathbb{N}$
- Initial configurations: $\quad I \rightarrow \mathbb{N}$



## Reachability graph for an initial configuration




## Markov chain for an initial configuration

## Underlying Markov chain:

(pairs of agents are picked uniformly at random)


## Runs

## Run: infinite path from initial configuration



## Predicate decided (computed) by a protocol

## Protocol decides $\varphi:$ InitC $\rightarrow\{\mathbf{0}, \mathbf{1}\}$ :

for every $C \in \operatorname{Init} C$, the runs starting at $C$ reach stable consensus $\varphi(C)$ with probability 1.


All agree to


All agree to $\Omega$


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Our protocol decides the predicate $\mathbf{x} \geq \mathbf{4}$

## The quest for succinct protocols

## Protocol for $\boldsymbol{x} \geq \boldsymbol{c}$

- States: $\{0,1,2, \ldots, c\}$
$\rightarrow \mathbf{c}+1$ states
- Initially, all agents in state 1
- $(m, n) \mapsto(m+n, 0)$ if $m+n<c$
- $(m, n) \mapsto(c, c)$

$$
\text { if } m+n \geq c
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## Protocol for $\boldsymbol{x} \geq \boldsymbol{c}$

- States: $\{0,1,2, \ldots, c\}$
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Exponentially many states in $\log c$, the length of $x \geq c$
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Exponentially many states in $\log c$, the length of $x \geq c$

Can we do better?

## State complexity of $\boldsymbol{x} \geq \boldsymbol{c}$ :

 minimal number of states of a protocol deciding it.PPs as a model for natural computing (chemical reaction networks):

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- Agent $\rightarrow$ molecule

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## Why care about state complexity?

PPs as a model for natural computing (chemical reaction networks):

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- Transition $\rightarrow$ chemical reaction

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$$
\begin{aligned}
\mathrm{CH}_{4}+2 \mathrm{O}_{2} & \rightarrow \mathrm{CO}_{2}+2 \mathrm{H}_{2} \mathrm{O} \\
(\mathrm{~A}, \mathrm{~B}, \mathrm{~B}) & \mapsto
\end{aligned}
$$

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Avogadro's number is $\sim 6 \times 10^{23}$, so we need the protocol for $\mathbf{c} \sim \mathbf{2}^{60}$.

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Color should change when the number of molecules in the flask reaches c.

We need to implement a protocol for $\boldsymbol{x} \geq \mathbf{c}$.

Avogadro's number is $\sim 6 \times 10^{23}$, so we need the protocol for $\mathbf{c} \sim \mathbf{2}^{\mathbf{6 0}}$.

But in chemical reaction networks

## \# states = \# chemical species

We need $2^{60}$ species.

## The quest for succinct protocols

## Protocol for $\mathbf{x} \geq \mathbf{2}^{\boldsymbol{k}}$

- States: $\left\{0,1,2, \ldots, 2^{k}\right\}$
$\rightarrow \mathbf{2}^{k}+1$ states
- Initially, all agents in state 1
- $(m, n) \mapsto(m+n, 0)$
if $m+n<2^{k}$
- $(m, n) \mapsto\left(2^{k}, 2^{k}\right)$
if $m+n \geq 2^{k}$


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## $\underline{\text { Protocol for } \mathbf{x} \geq \mathbf{2}^{\boldsymbol{k}}}$

- States: $\left\{\mathbf{0}, \mathbf{2}^{\mathbf{0}}, \ldots, \mathbf{2}^{\boldsymbol{k}-\mathbf{1}}, \mathbf{2}^{\boldsymbol{k}}\right\}$
$\rightarrow \mathbf{k}+\mathbf{2}$ states
- Initially, all agents in state $\mathbf{2}^{\mathbf{0}}$
- $\left(\mathbf{2}^{\ell}, \mathbf{2}^{\ell}\right) \mapsto\left(\mathbf{2}^{\ell+1}, \mathbf{0}\right)$ if $\ell+\mathbf{1} \leq \boldsymbol{k}$
- $\left(2^{k}, n\right) \mapsto\left(\mathbf{2}^{k}, 2^{k}\right)$


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## Protocol for $\boldsymbol{x} \geq \mathbf{2}^{\boldsymbol{k}}$

Extensible to arbitrary $\mathbf{x} \geq \mathbf{c}$ predicates: $\mathcal{O}(\log \mathbf{c})$ states (not totally trivial).

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Can we do even
better?
Is $O(\log \log c)$ possible?

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The quest for succinct protocols

Not for every c...

Blondin, E., Jaax STACS'18
There exist infinitely many c such that every protocol for $\mathbf{x} \geq \mathbf{c}$ has at least $(\log \mathbf{c})^{1 / 4}$ states

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There exist infinitely many c such that every protocol for $\mathbf{x} \geq \mathbf{c}$ has at least $(\log \mathbf{c})^{1 / 4}$ states
...but for infinitely many c, if we allow leaders.

## A protocol with a leader for $x=y$

Initially ninjas are blue or red.
Question to be decided: same number of blue and red ninjas?
One leader helps the ninjas. Leader searches for pairs of blue-red ninjas, "neutralizing them", until no such pairs left.

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Transitions:


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For infinitely many $\mathbf{c}$ there is a protocol with a leader and $\mathcal{O}(\log \log \mathbf{c})$ states that computes $\mathbf{x} \geq \mathbf{c}$

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## Proof:

Mayr and Meyer '82: For every $n$ there is a reversible Petri net of size $O(n)$ and two places $\boldsymbol{s}, t$ such that the shortest firing sequence leading from $s$ to $t$ has length $\Theta\left(\mathbf{2}^{2^{n}}\right)$

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For every $n$ there is a reversible protocol with a leader and $O(n)$ states and transitions s．t．

- 首，旁 are two states of the leader，
- 合 is the initial state of the normal agents，and
- The leader may move from 咅 to 合 iff the number of啇 is at least $2^{2^{n}}$


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Add transitions 首，q $\mapsto \dot{\text { 咅，啇 for every state q }}$
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At least $2^{2^{n}}$ 合：leader eventually reaches w．p． 1 and attracts everyone to 高，and so to $\begin{aligned} & 3\end{aligned}$ ．

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At least $2^{2^{n}}$ 合：leader eventually reaches w．p． 1 and attracts everyone to 高，and so to $\begin{aligned} & 3\end{aligned}$ ．
Less than $2^{2^{n}}$ 曾：leader never reaches 音．

## How far can we go?

Czerner, E., PODC'21
Every protocol for $\mathbf{x} \geq \mathbf{c}$, with or without leaders, has $\Omega(\alpha(\mathbf{c}))$ states, where $\alpha$ is the inverse of (some variant of) the Ackermann function.

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## Proof technique for all bounds:

Find numbers $\boldsymbol{a}, \boldsymbol{b}$ such that

- protocol outputs $-\underset{\sim}{ }$ for $\boldsymbol{a}$; and
- if protocol outputs for $\boldsymbol{a}+\boldsymbol{b}$, then it outputs $\mathbb{\sim}$ for $\boldsymbol{a}+\boldsymbol{\lambda} \boldsymbol{b}$ for every $\boldsymbol{\lambda} \in \mathbb{N}$.

Then protocol outputs for $\boldsymbol{a}$ and $\mathbb{Z}$ for $\boldsymbol{a}+\boldsymbol{b}$, which implies $\boldsymbol{a}<\boldsymbol{c} \leq \boldsymbol{a}+\boldsymbol{b}$.

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Existence of $\boldsymbol{a}$ and $\boldsymbol{a}+\boldsymbol{b}$ derived from Dickson's lemma.

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Czerner, E., Leroux 21, Submitted
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Bound on $\boldsymbol{a}+\boldsymbol{b}$ derived from

- Rackoff's theorem (used to obtain a clover of the set of configurations that are a stable consensus whose elements have double exponential norm).
- Pottier's small basis theorem for systems of Diophantine equations.


## How far can we go?

## Leroux 21, arXiv

Every protocol for $\boldsymbol{x} \geq \mathbf{c}$, with or without leaders, has $\Omega\left((\log \log \mathbf{c})^{1 / 3}\right)$ states.

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Every protocol for $\mathbf{x} \geq \mathbf{c}$, with or without leaders, has $\Omega\left((\log \log c)^{1 / 3}\right)$ states.

Bound uses all of the above, plus some stuff I'll leave to Jérôme ...

## This far we've come

## Summary

For every $\mathbf{c}$, there is a leaderless protocol with $\mathcal{O}(\log \boldsymbol{c})$ states.
For every $\mathbf{c}$, every protocol, with or without a leader, has $\Omega\left((\log \log \mathbf{c})^{1 / 3}\right)$ states.
For infinitely many $\mathbf{c}$, there is a protocol with a leader with $\mathcal{O}(\log \log c)$ states.

Open question: Are there leaderless protocols with $\mathcal{O}(\log \log \boldsymbol{c})$ states for infinitely many $\mathbf{c}$ ?

# State complexity of general Presburger predicates 

## Angluin, Aspnes, Eisenstat Dist. Comp.'07

Population protocols decide precisely the predicates definable in Presburger arithmetic, i.e. $\operatorname{FO}(\mathbb{N},+,<)$

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## PPs for all Presburger predicates

Using that Presburger arithmetic has quantifier elimination, Angluin et al. proceed as follows:

1) Exhibit PPs for threshold and modulo predicates

$$
\boldsymbol{a}_{1} x_{1}+\cdots+\boldsymbol{a}_{k} x_{k} \leq \boldsymbol{b} \quad \boldsymbol{a}_{1} x_{1}+\cdots+\boldsymbol{a}_{k} x_{k} \equiv b \bmod c
$$

2) Show that predicates decidable by PPs are closed under negation and conjunction

State complexity of general Presburger predicates

Angluin, Aspnes, Eisenstat Dist. Comp.'07
Population protocols decide precisely the predicates definable in Presburger arithmetic, i.e. $\operatorname{FO}(\mathbb{N},+,<)$

Exponential state complexity in both

- the number of bits of the coefficients, and
- the number of threshold and modulo predicates.

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Can polynomial state complexity be achieved?

## A protocol for $x-y \geq 2^{k}$ with $O(k)$ states

## Protocol for $\mathbf{x} \geq \mathbf{2}^{\boldsymbol{k}}$

States: $\left\{\mathbf{0}, \mathbf{2}^{\mathbf{0}}, \ldots, \mathbf{2}^{\boldsymbol{k}}\right\}$
Initially: all ninjas in state 1
$\left(\mathbf{2}^{\ell}, \mathbf{2}^{\ell}\right) \mapsto\left(\mathbf{2}^{\ell+1}, 0\right)$
if $\ell+1 \leq k$
$\left(2^{k}, n\right) \mapsto\left(2^{k}, 2^{k}\right)$

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A ninja that
"climbs the ladder"
attracts all others to
the top


## A protocol for $x-y \geq 2^{k}$ with $O(k)$ states

## Protocol for $\mathbf{x}-\boldsymbol{y} \geq \mathbf{2}^{\boldsymbol{k}}$

States: $\left\{-\mathbf{1}, \mathbf{0}, \mathbf{2}^{\mathbf{0}}, \ldots, \mathbf{2}^{\mathbf{k}}\right\}$ Initially: $\boldsymbol{x}, \boldsymbol{y}$ ninjas in $\mathbf{1 , - 1}$
$\left(\mathbf{2}^{\ell}, \mathbf{2}^{\ell}\right) \mapsto\left(\mathbf{2}^{\ell+1}, 0\right)$
if $\ell+1 \leq k$
$\left(2^{k}, n\right) \mapsto\left(2^{k}, 2^{k}\right)$
$(1,-1) \mapsto(0,0)$


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$(1,-1) \mapsto(0,0)$
Not yet
correct!


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$(1,-1) \mapsto(0,0)$
$\left(\mathbf{2}^{\ell}, 0\right) \mapsto\left(\mathbf{2}^{\ell-1}, 2^{\ell-1}\right)$
if $\ell \leq 1$


## All predicates have polynomial state complexity

Blondin, E., Genest, Helfrich, Jaax STACS'20
Every predicate $\varphi$ of quantifier-free Presburger arithmetic can be decided by a leaderless protocol with a polynomial number of states in $|\varphi|$.

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## Construction

Quite sophisticated "protocol engineering" !

1) Use "up and down" ladders plus other constructions to give PPs for threshold and modulo predicates with polynomial number of states.
2) Given protocols with sets of states $n_{1}$ and $n_{2}$ for $\varphi_{1}$ and $\varphi_{2}$, construct a protocol for $\varphi_{1} \wedge \varphi_{2}$ with $\mathcal{O}\left(n_{1}+n_{2}\right)$ states using protocols with reversible dynamic initialization.

## But are they fast ... ?

## Protocol for $\boldsymbol{x}-\boldsymbol{y} \geq \mathbf{2}^{\boldsymbol{k}}$

States: $\left\{-\mathbf{1}, \mathbf{0}, \mathbf{2}^{\mathbf{0}}, \ldots, \mathbf{2}^{\boldsymbol{k}}\right\}$ Initially: $\boldsymbol{x}, \boldsymbol{y}$ ) ninjas in $\mathbf{1 , - 1}$
$\left(\mathbf{2}^{\ell}, \mathbf{2}^{\ell}\right) \mapsto\left(\mathbf{2}^{\ell+1}, \mathbf{0}\right)$
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if $\ell \leq 1$


## But are they fast ... ?

## Very slow!

Exponential expected time to convergence in the number of ninjas.

Protocols of Angluin et al. run in $\mathcal{O}(n \log n)$ time.


## But are they fast ... ?

Are there
fast and succinct
protocols for
all Presburger
predicates?


## Two years and 50 pages later ...

## Czerner, Guttenberg, Helfrich, E. Submitted

Every predicate $\varphi$ of quantifier-free Presburger arithmetic can be decided by a leaderless protocol

- with $|\varphi|$ states,
- running in $\mathcal{O}(n)$ expected time for all inputs of size $\Omega(|\varphi|)$.


## Two years and 50 pages later ...

One of the ideas ...


## Two years and 50 pages later ...

One of the ideas ...


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One of the ideas...


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One of the ideas ...


## Conclusion

# State complexity of population protocols is a fundamental question of distributed computation: 

- Crucial for applications in natural computing
- Limits of collective knowledge
- Role of leaders


## Conclusion

State complexity of counting predicates $\boldsymbol{x} \geq \boldsymbol{c}$ Leaderless protocols

- $\Omega\left((\log \log \boldsymbol{c})^{1 / 3}\right)$ and $\mathcal{O}(\log \boldsymbol{c})$ states.
- Not known if $\Theta\left((\log \log \boldsymbol{c})^{1 / 3}\right)$ achievable for some family of $\boldsymbol{c}$.


## Conclusion

## State complexity of counting predicates $x \geq c$

 Protocols with a leader- $\Omega\left((\log \log \boldsymbol{c})^{1 / 3}\right)$ and $\mathcal{O}(\log \boldsymbol{c})$ states.
- $\Theta(\log \log \boldsymbol{c})$ for infinitely many $\mathbf{c}$.


## Conclusion

## Succint protocols for Presburger predicates:

## States Expected time

Angluin et al. ‘04 $\quad 2^{\Theta(|\varphi|)} \quad \Theta(n \log n)$
Blondin et al. '20 poly $(|\varphi|) \quad 2^{\Omega(n)}$
Czerner et al. '21 $\Theta(|\varphi|) \quad \Theta(n)$
for inputs of size $\Omega(|\varphi|)$


THANK YOU!

