## Verification of Population Protocols

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Joint work with Pierre Ganty, Jérôme Leroux, and Rupak Majumdar

## Deaf Black Ninjas in the Dark

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- How can they conduct the vote?


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- Each Ninja stores their current estimation of the final outcome of the vote (Yes or No). Additionally, it is Active or Passive.
- Initially all Ninjas are Active, and their initial estimation is their own vote
- Ninjas follow this protocol:

$$
\begin{array}{llc}
(Y A, N A) & \rightarrow(N P, N P) & \text { (opposite votes "cancel") } \\
(Y A, N P) & \rightarrow(Y A, Y P) & \text { (active "survivors" tell } \\
(N A, Y P) & \rightarrow(N A, N P) & \text { outcome to passive Ninjas) } \\
(N P, Y P) \rightarrow(N P, N P) & \text { (to deal with ties) }
\end{array}
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Theoretical model for distributed computation
Proposed in 2004 by Angluin et al.
Designed to model collections of
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- ... and Ninjas


## Syntax

A PP-scheme is a pair $(Q, \Delta)$, where

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Intuition:
if $\quad\left(q_{1}, q_{2}\right) \mapsto\left(q_{1}^{\prime}, q_{2}^{\prime}\right) \in \Delta$ and two agents in states $q_{1}$ and $q_{2}$ "meet", then the agents can interact and change their states to $q_{1}^{\prime}, q_{2}^{\prime}$.

Assumption: at least one interaction for each pair of states (possibly $\left.\left(q_{1}, q_{2}\right) \mapsto\left(q_{1}, q_{2}\right)\right)$

## Semantics

Configuration: mapping $C: Q \rightarrow \mathbb{N}$, where $C(q)$ is the current number of agents in state $q$.

| $q_{1}$ | $q_{2}$ | $q_{3}$ | $q_{4}$ |
| :---: | :---: | :---: | :---: |
| $(2)$ | 1 | 0 | 3 |

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Execution: infinite sequence $C_{0} \rightarrow C_{1} \rightarrow C_{2} \rightarrow \cdots$ of steps

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- A partition of $Q$ into 1 -states (green) and 0 -states (pink)

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An execution reaches consensus $b \in\{0,1\}$ if from some point on every agent stays within the $b$-states.

## Computing with PPs

A PP computes the value $b$ for input $\left(n_{1}, n_{2}, \ldots, n_{k}\right)$ if executions starting at the configuration
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A PP computes $P\left(x_{1}, \ldots, x_{n}\right): \mathbb{N}^{n} \rightarrow\{0,1\}$ if it computes $P\left(n_{1}, \ldots, n_{k}\right)$ for every input $\left(n_{1}, \ldots, n_{k}\right)$

## Previous work

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- PPs compute exactly the Presburger predicates (Angluin et al. 2007)
- Probabilistic PPs (Angluin et al. 2004-2006, Chatzigiannakis and Spirakis, 2008)
- Fault-tolerant PPs (Delporte-Gallet et al. 2006)
- Private computation in PPs (Delporte-Gallet et al. 2007)
- PPs with identifiers (Guerraoui et al. 2007)
- PPs with a leader (Angluin et al. 2008)
- Mediated PPs (Michail et al., 2011)
- Trustful PPs (Bournez et al., 2013)


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Well-specification problem: Given a protocol, decide if it is well-specified.

Correctness problem: Given a protocol and a Presburger predicate, decide if the protocol is well-specified and computes the predicate.

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Not complete or not automatic.

## Main results

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Theorem: The well-specification and correctness problems can be reduced to the reachability problem for Petri nets, and are thus decidable.

Theorem: The reachability problem for Petri nets can be reduced to the well-specification and correctness problems for PPs.

## From PPs to Petri nets

Population protocols Petri nets
State
Place

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Place
Transition with input places $q_{1}, q_{2}$ output places $q_{1}^{\prime}, q_{2}^{\prime}$

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## State <br> Interaction <br> $\left(q_{1}, q_{2}\right) \mapsto\left(q_{1}^{\prime}, q_{2}^{\prime}\right)$

PP-scheme

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Net without marking

## From PPs to Petri nets

## Population protocols Petri nets

## State

Interaction
$\left(q_{1}, q_{2}\right) \mapsto\left(q_{1}^{\prime}, q_{2}^{\prime}\right)$

PP-scheme
Configuration

Place
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## From PPs to Petri nets

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| :--- | :--- |
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| PP-scheme | Net without marking |
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| PP | Net + family of <br> initial markings |

## Some results from Petri net theory

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Theorem [Easy generalization]: Given two Presburger sets of markings $\mathcal{M}_{1}, \mathcal{M}_{2}$, it is decidable if some marking of $\mathcal{M}_{2}$ is reachable from some marking of $\mathcal{M}_{1}$

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Our main technical result: The set of all configurations belonging to all bottom SCCs of a PP, for all initial configurations, is effectively Presburger.

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Our main technical result: The set of all configurations belonging to all bottom SCCs of a PP, for all initial configurations, is effectively Presburger.
Fact: A PP is ill-specified iff there is an initial configuration $C$ and

- a bottom SCC reachable from $C$ with agents in both 0 - and 1-states; or
- two bottom SCCs, one with only 0 -states and the other with only 1 -states, both reachable from $C$.


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- I: markings corresponding to initial configurations
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- Construct the net $N \| N$ (two copies of $N$ side by side).
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- Check if $\mathcal{B}_{\text {true }} \times \mathcal{B}_{\text {false }}$ is reachable from $\mathcal{I}_{2}$ (using reachability in Petri nets)


## Further results

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## Thank You

