

On the Necessary Memory to Compute the Plurality in Multi-Agent Systems

Emanuele Natale



COATI



joint work with
Iliad Ramezani (SUT, Iran)



Rome, 29 May 2019

Outline

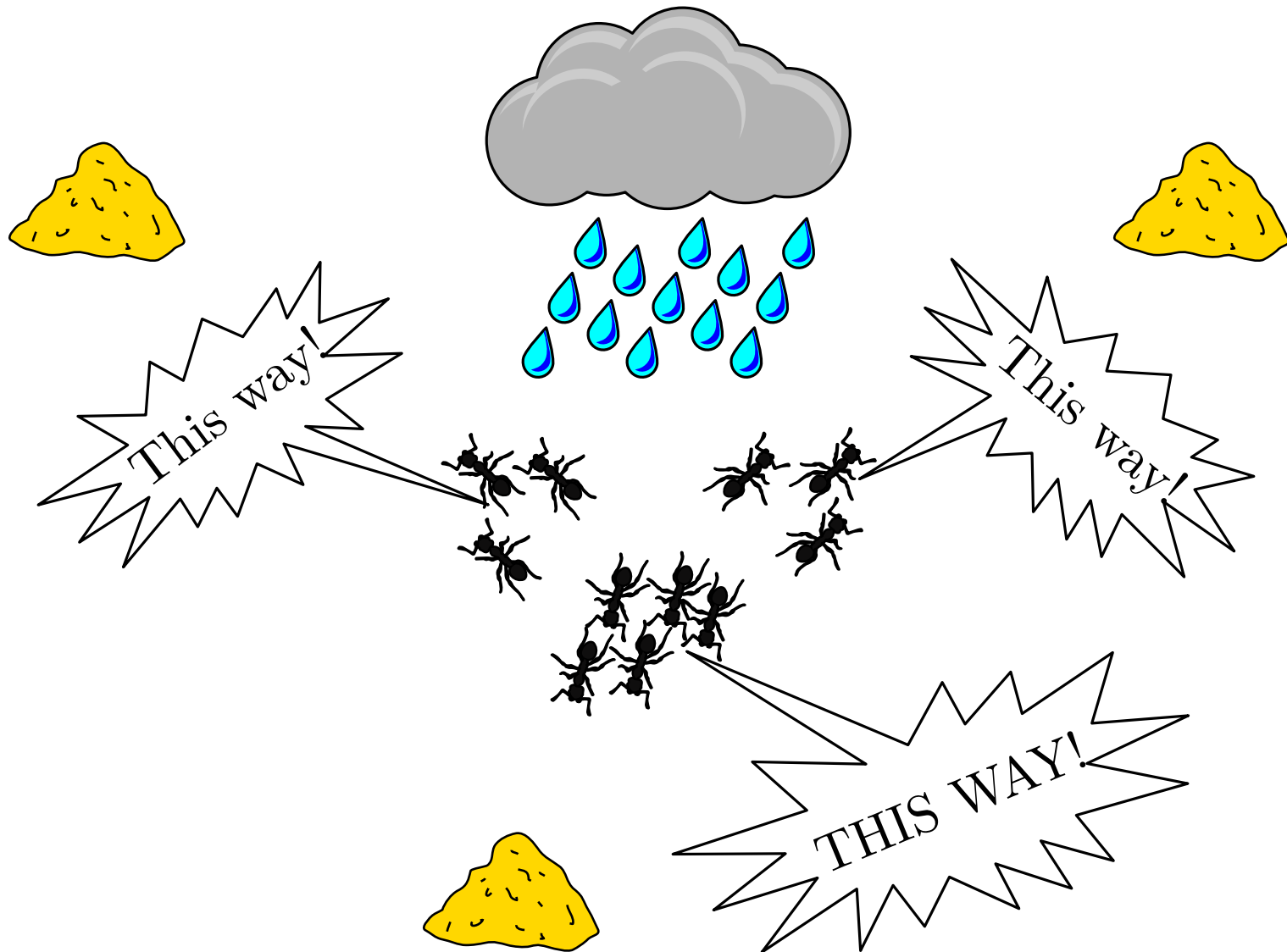
- Problem: k -Plurality Consensus
- Model: Population Protocols
- Simple case: Majority Consensus
- Previous Work: $\Omega(2^k)$ Conjecture
- $\Omega(k^2)$ Lower Bound
- Previous Work: $O(k^6)$ *Almost* Refutation
- $O(k^{11})$ Upper Bound

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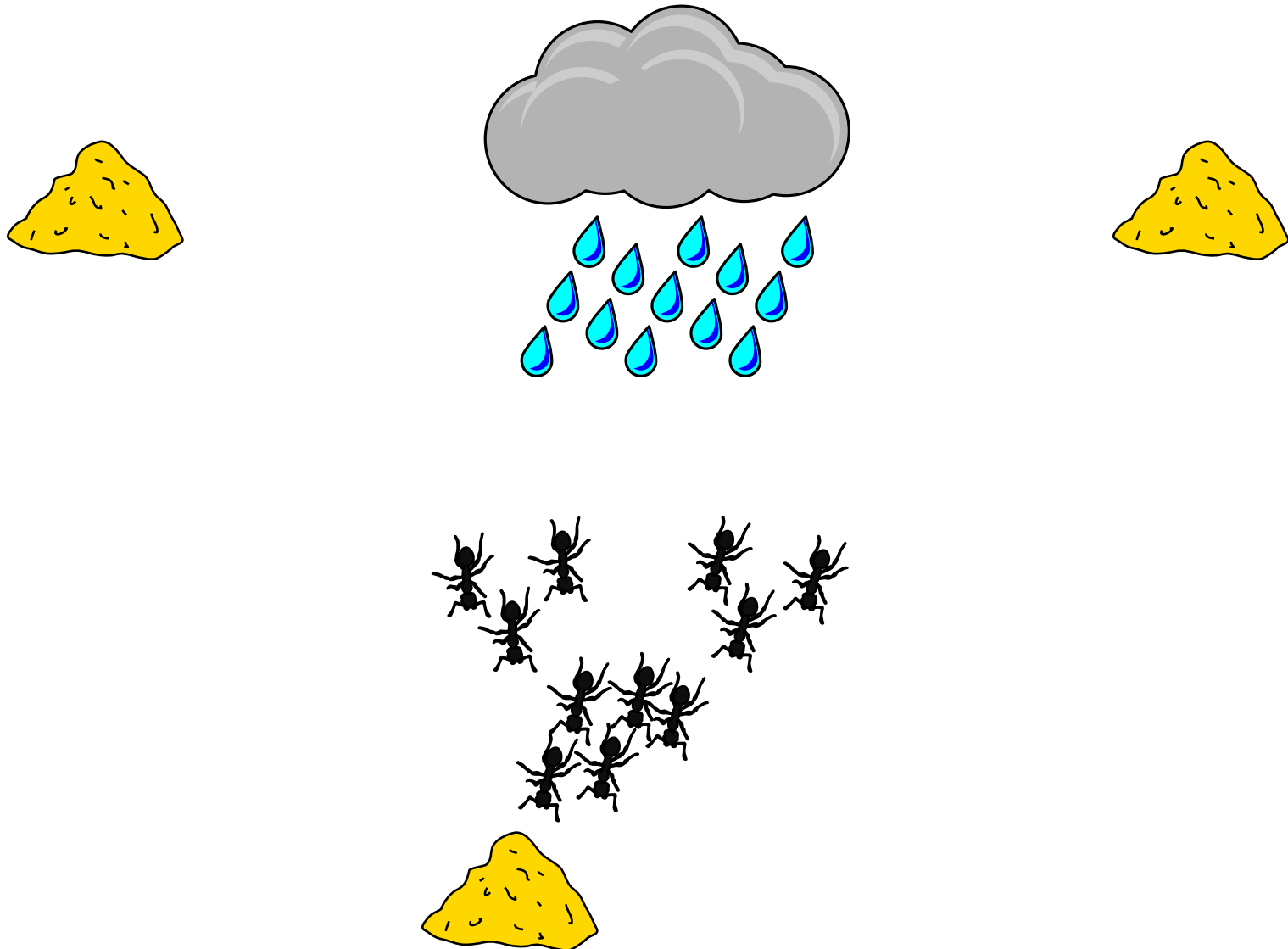
k -Plurality Consensus

Each agent supports one out of k opinions



k -Plurality Consensus

All agents eventually support the same opinion



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Population Protocols

AKA chemical reaction networks, poisson clock models, etc.



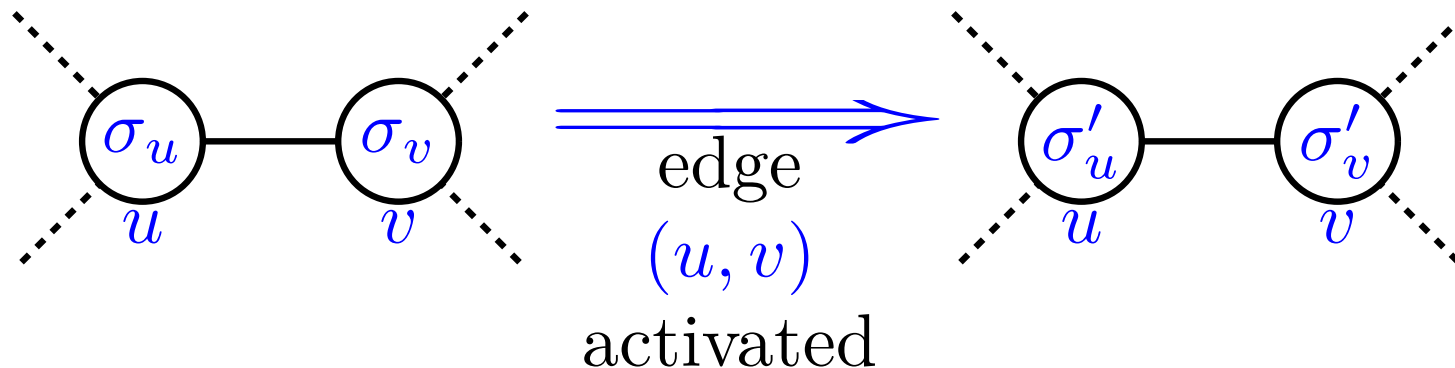
Population Protocols

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- (Directed) graph G ,
- set of nodes' states
 $\Sigma = (\sigma_u)_{u \in V}$,
- edges activated by a *scheduler*,
- function $\gamma : \Sigma \times \Sigma \rightarrow \Sigma \times \Sigma$ s.t.
if edge (u, v) with states
 (σ_u, σ_v) activated, new states
are

$$\gamma(\sigma_u, \sigma_v) = (\sigma'_u, \sigma'_v)$$



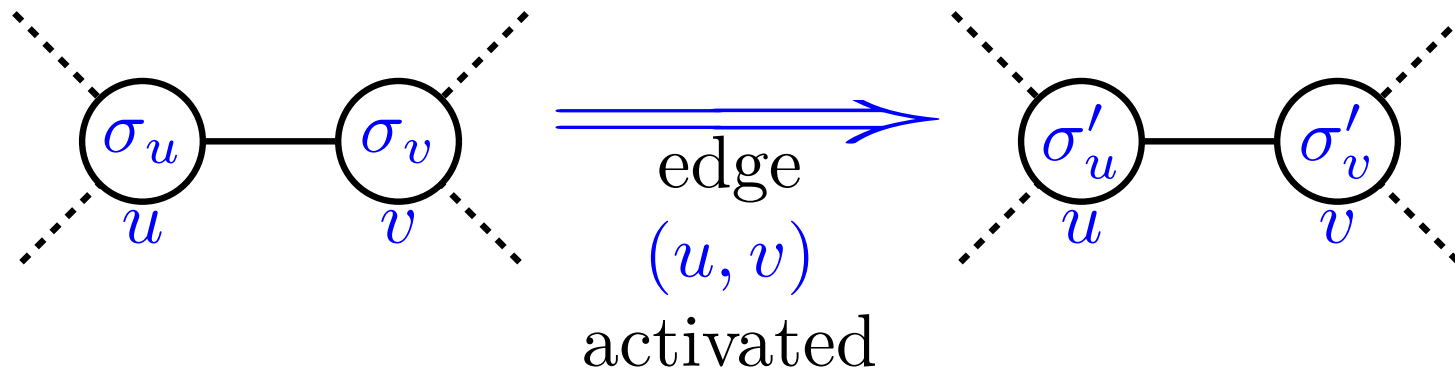
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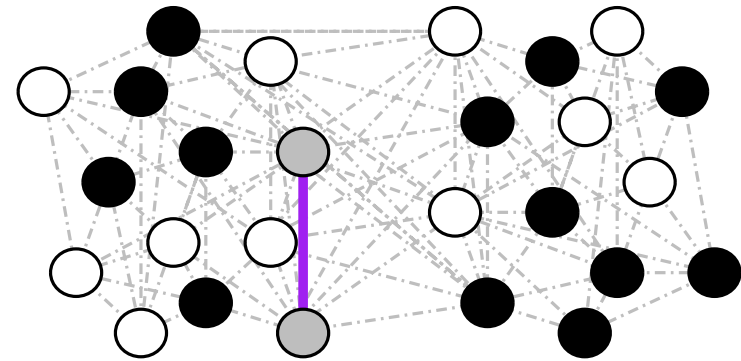
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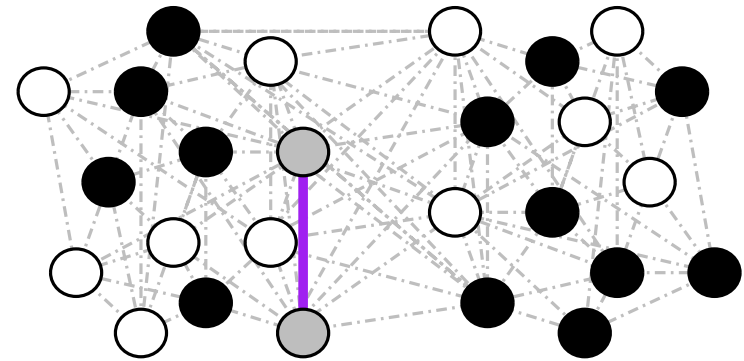
Population Protocols: Schedulers

Probabilistic scheduler:
activate an edge chosen
at random



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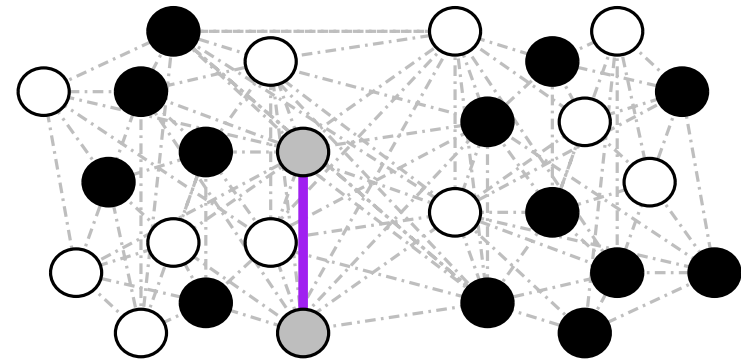
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What if a protocol P should never fail?

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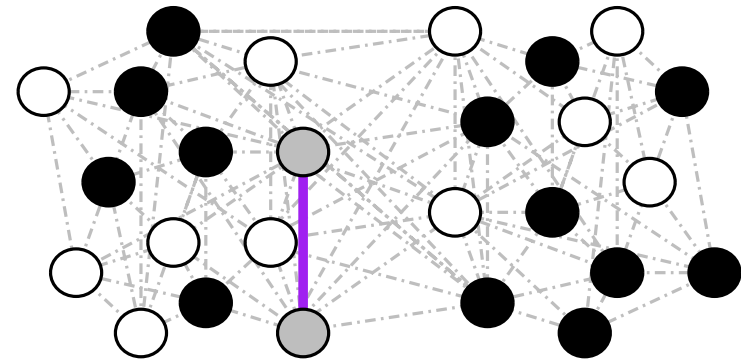
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A *configuration* is the state of all nodes $S = (\sigma_1, \dots, \sigma_n)$.

S' *reachable* from S if it is possible to activate edges such that S becomes S' .

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A *configuration* is the state of all nodes $S = (\sigma_1, \dots, \sigma_n)$.
 S' *reachable* from S if it is possible to activate
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Fair scheduler: if S appears infinitely often, also
any conf. reachable from S appears infinitely often:

S' reachable from S and $S_1, S_2, \dots, S, \dots, S, \dots, S, \dots$
 $\implies S_1, S_2, \dots, S', \dots, S', \dots, S', \dots$

Self-Stabilization

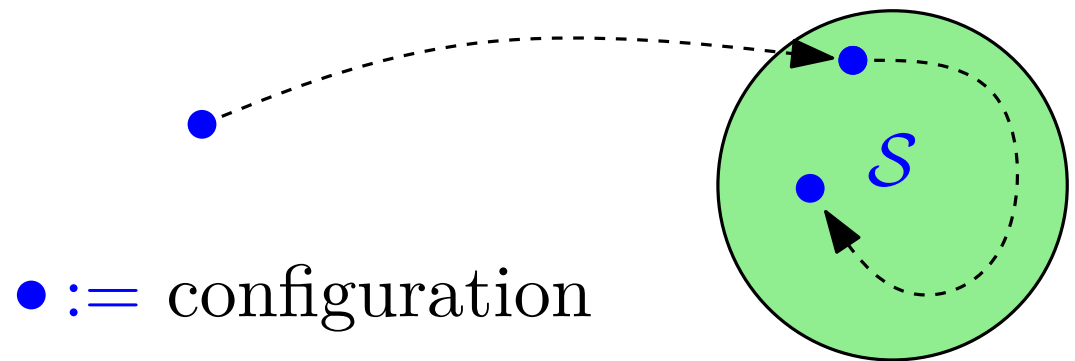
n agents with states in Σ . Σ^n possible configurations.

$\mathcal{S} := \{ \text{“correct states of the system”} \}$.

Convergence. Starting from any possible configuration, the system eventually reaches a configuration in \mathcal{S} .

Closure. If configuration in \mathcal{S} , it remains in \mathcal{S} .

A protocol is
self-stabilizing iff
guarantees
convergence and
closure w.r.t. \mathcal{S} .



Outline

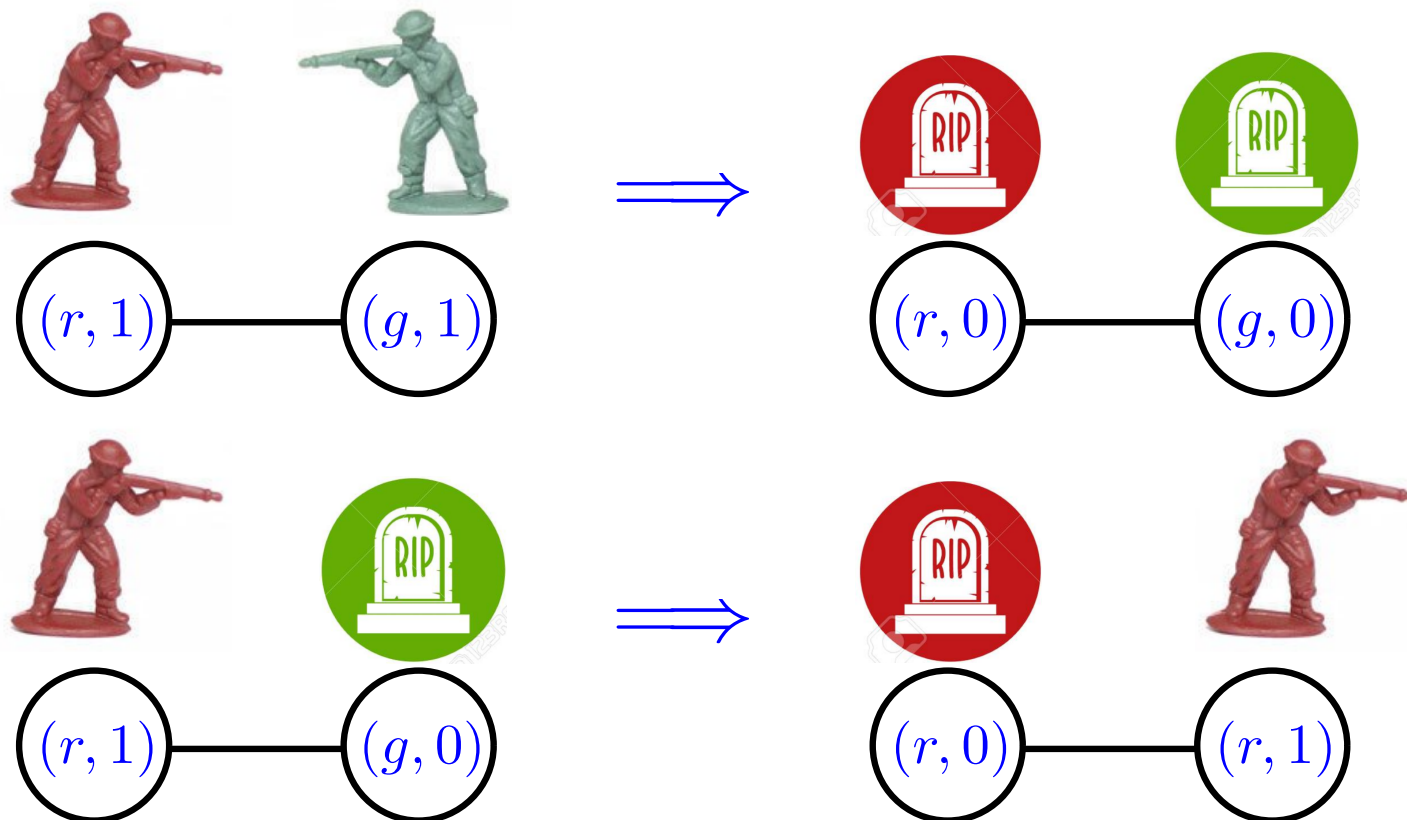
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Majority (2-Plurality) Consensus: 2-bit Protocol

[Mertzios et al. ICALP'16,

State: (green/red, defended or not) Benezit et al. ICASSP'09]

$u \setminus v$	$(g, 0)$	$(g, 1)$	$(r, 0)$	$(r, 1)$
$(g, 0)$	—	$((g, 1), (g, 0))$	—	$((r, 1), (r, 0))$
$(g, 1)$	$((g, 0), (g, 1))$	—	$((g, 0), (g, 1))$	$((g, 0), (r, 0))$
$(r, 0)$	—	$((g, 1), (g, 0))$	—	$((r, 1), (r, 0))$
$(r, 1)$	$((r, 0), (r, 1))$	$((r, 0), (g, 0))$	$((r, 0), (r, 1))$	—



Majority Consensus: 2-bit Lower Bound

[Mertzios et al. ICALP'16]

Three possible states: $1, 0, \alpha$.

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Observe: α counts either as “output 1 ” or “output 0 ”.

Wlog assume α counts as “output 0 ”.

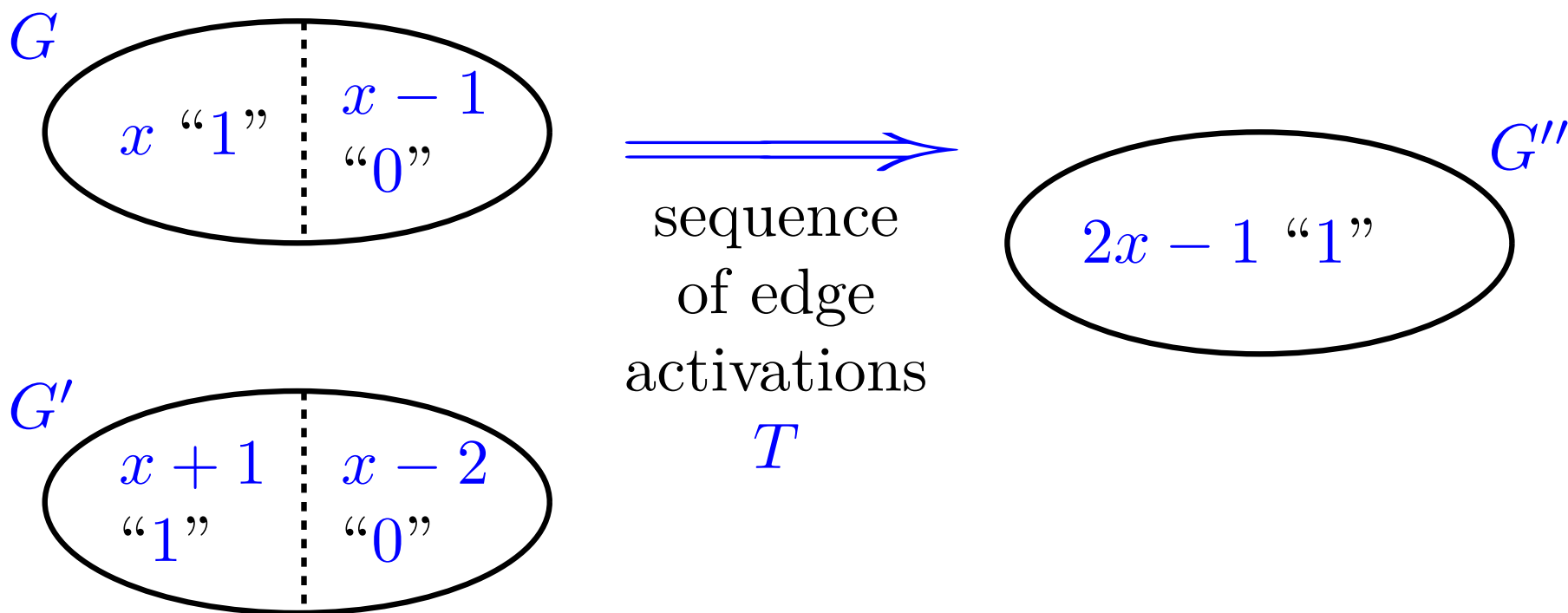
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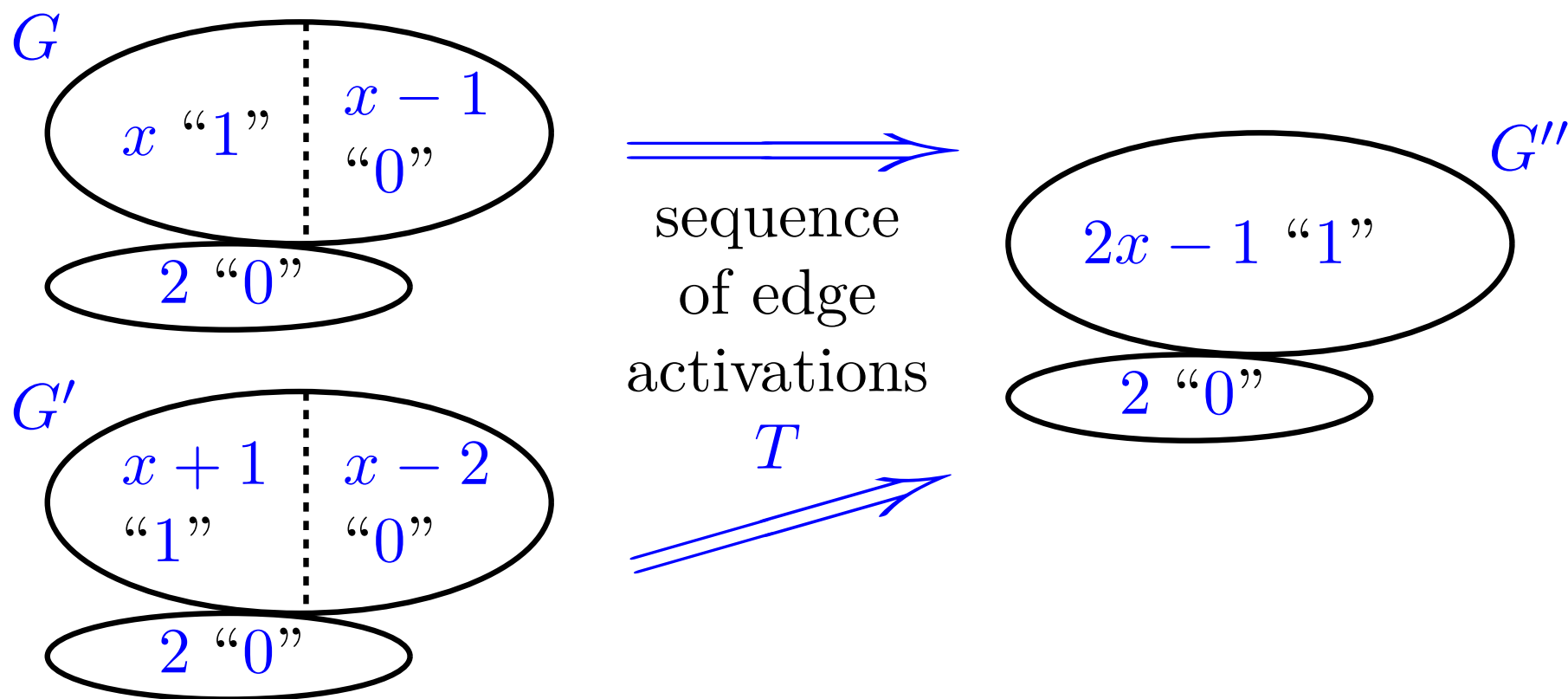
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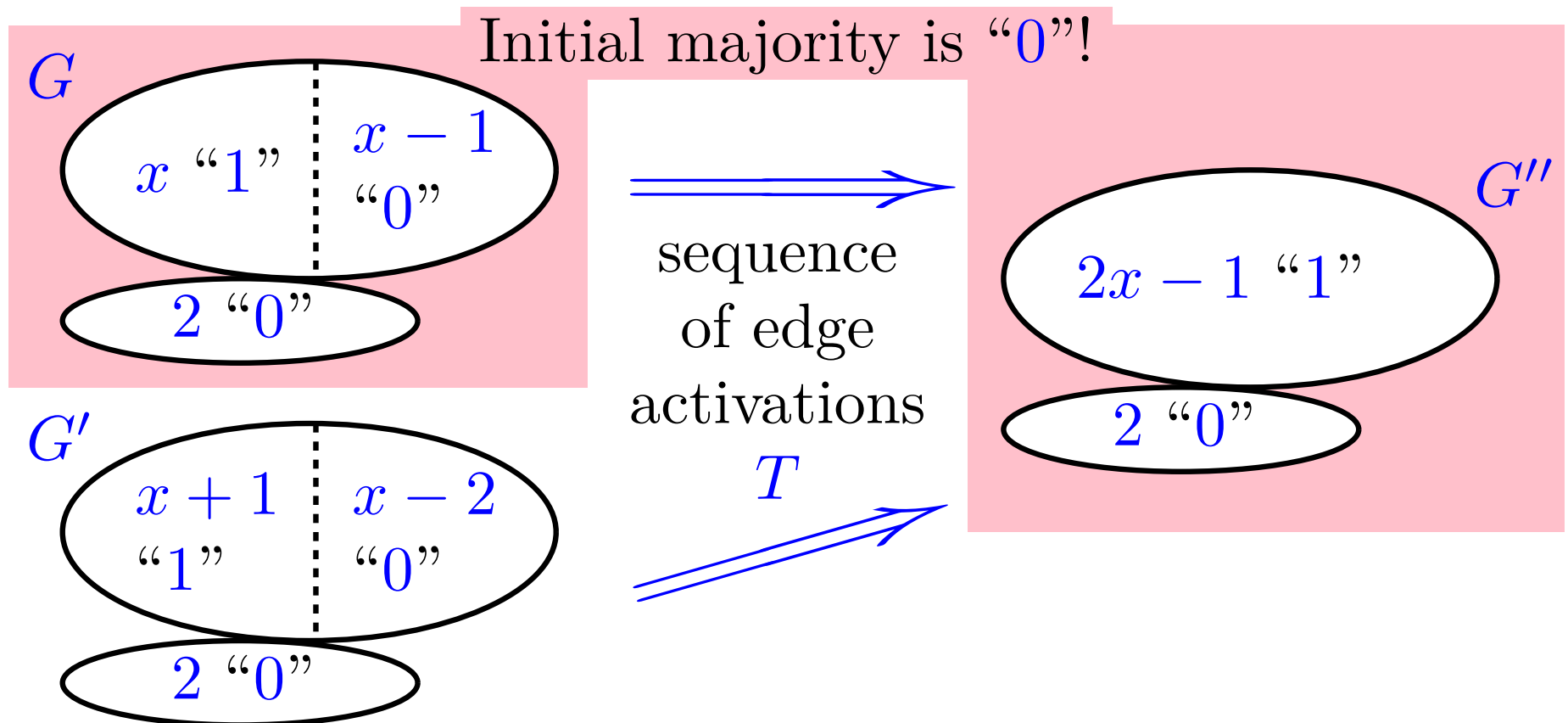
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Salehkaleybar et al.'s Conjecture [TSIPN'15]

Problem. Plurality consensus in population protocols with fair scheduler.

Opinions can *only be tested for equality*.

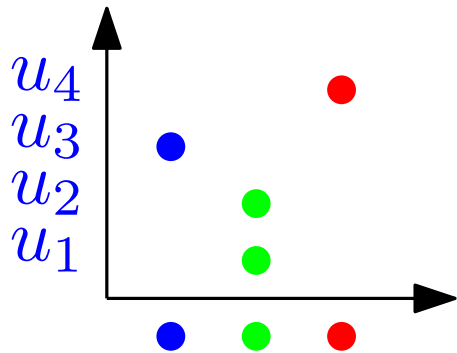
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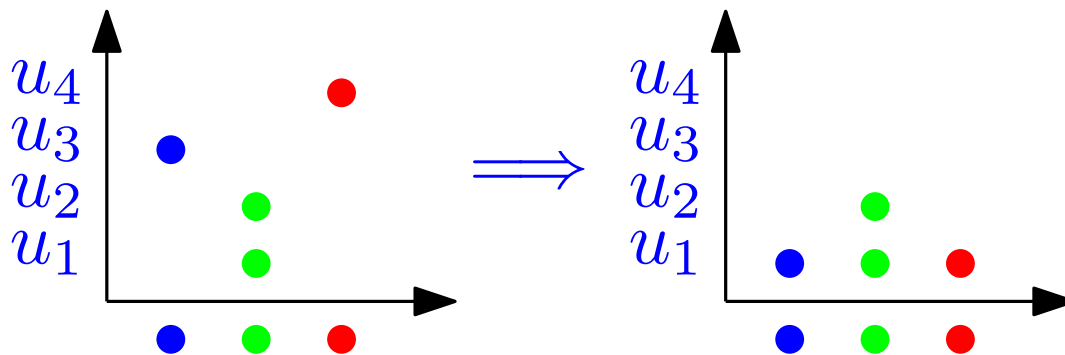
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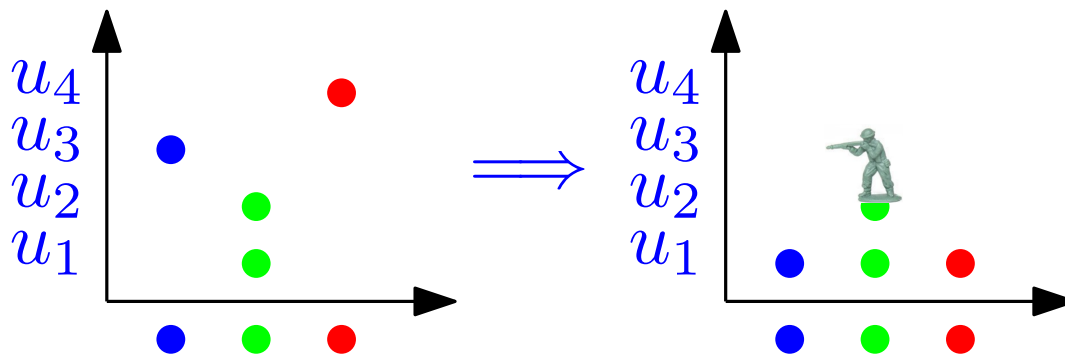
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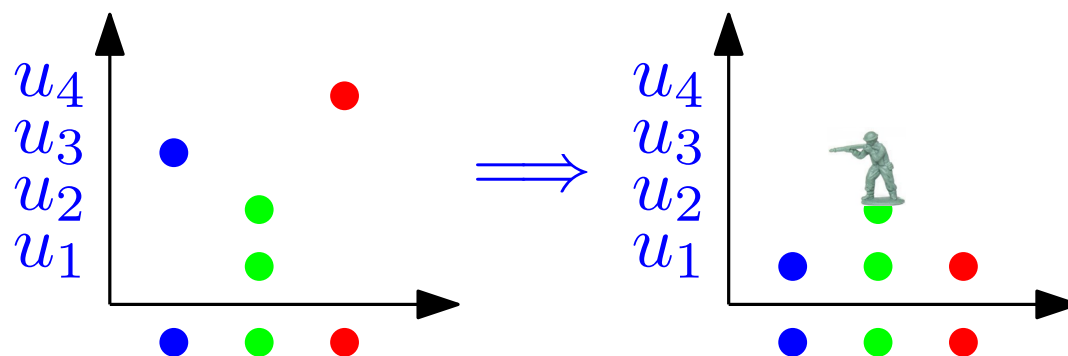
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Coins are accumulated on few nodes

- When (u, v) interact:

$$\begin{aligned} \text{new coins}(u) &= \text{coins}(u) \cap \text{coins}(v) \\ \text{new coins}(v) &= \text{coins}(u) \cup \text{coins}(v) \end{aligned}$$

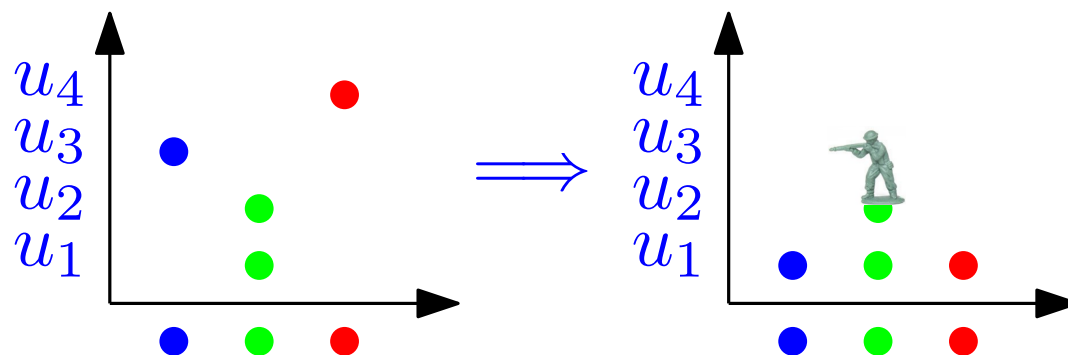
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Potential function

$$\sum_v |\text{coins}(v)|^2$$

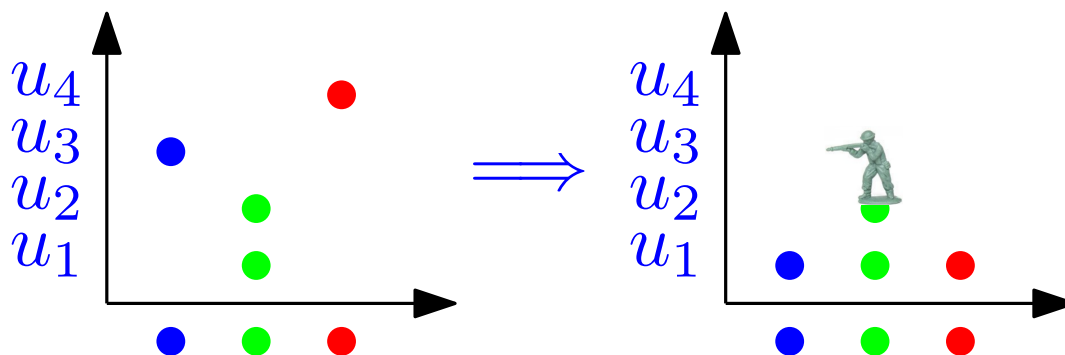
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Conjecture. $O(2^k)$ states are necessary.

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$\Omega(k^2)$ Lower Bound I

k colors, Σ states.

Protocol P eventually reaches plurality consensus.

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In at most $\approx \left(\frac{2e \cdot x}{\frac{|\Sigma|}{k} - 1}\right)^{\frac{|\Sigma|}{k} - 1}$ config.s all nodes output c^* .

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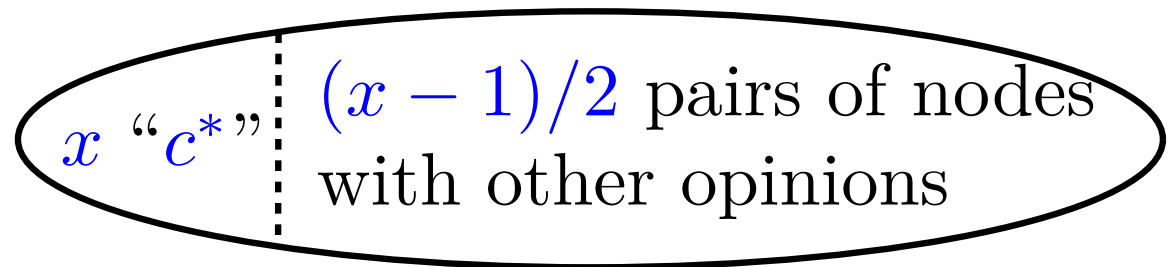
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$\approx \left(\frac{x-1}{2k-4}\right)^{k-2}$ initial
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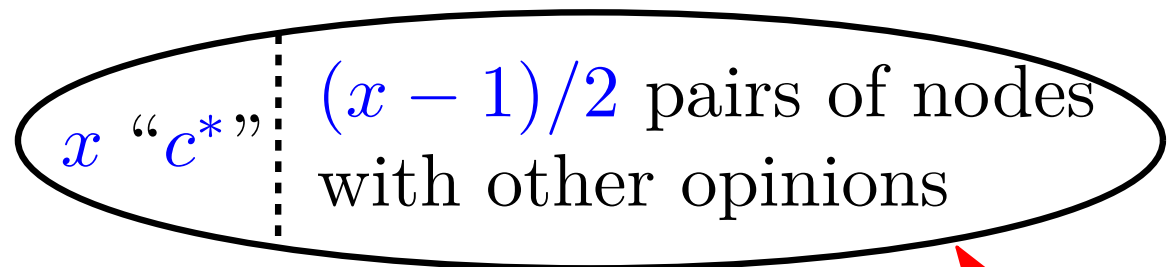
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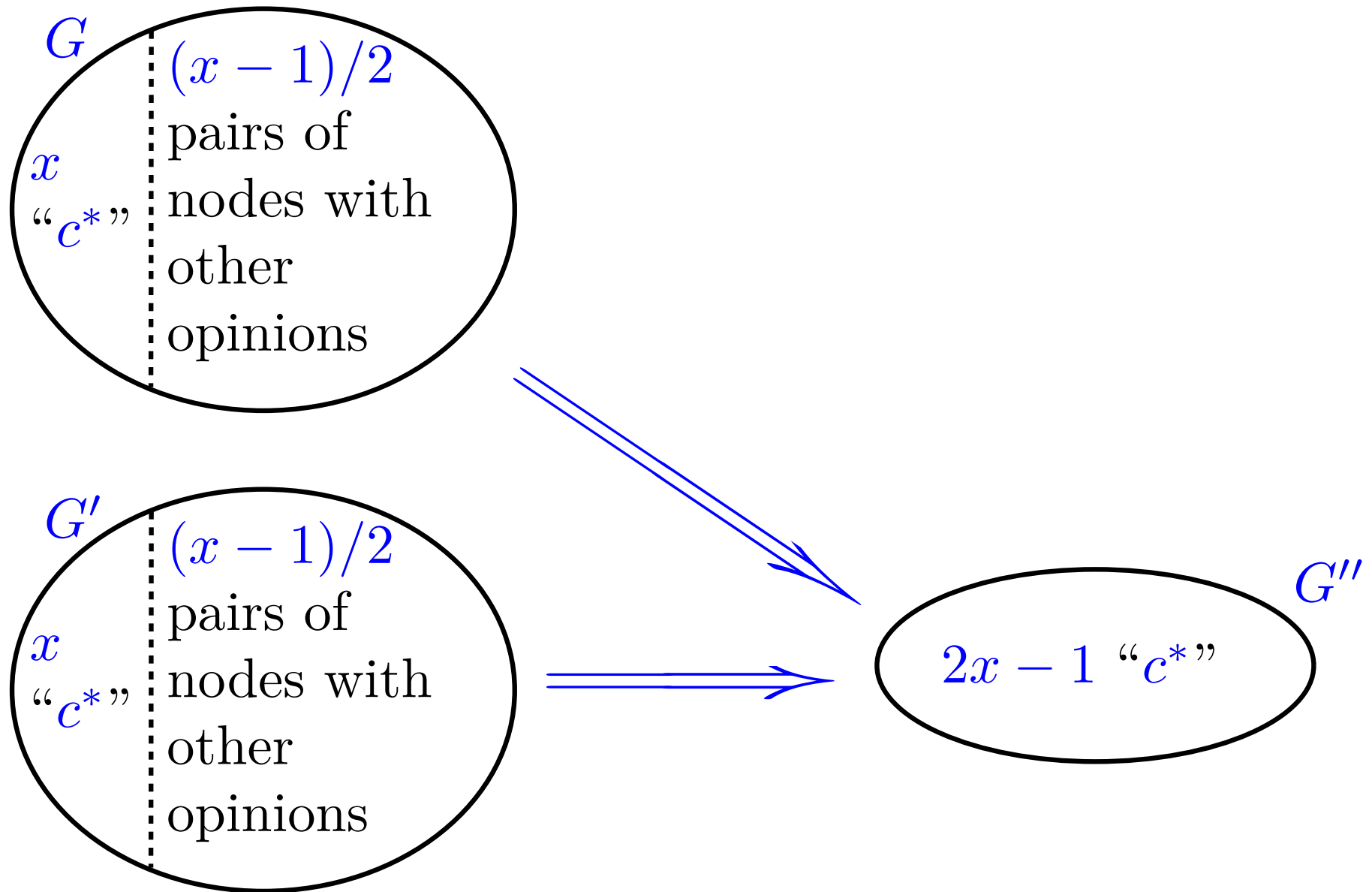
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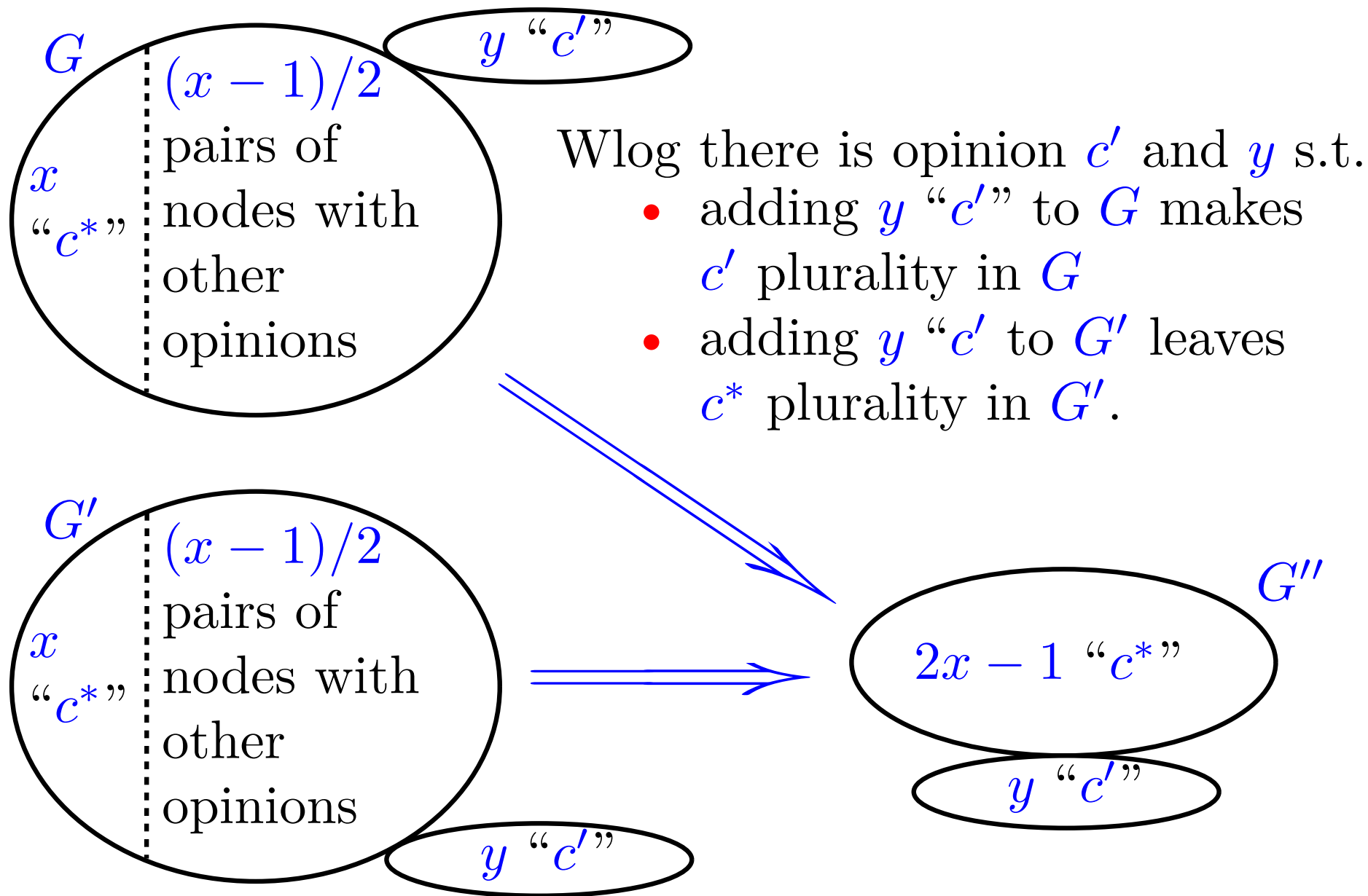


Pigeonhole: if $|\Sigma| < k^2 - k$, 2 config.s G and G' in  converge to identical configurations.

$\Omega(k^2)$ Lower Bound II



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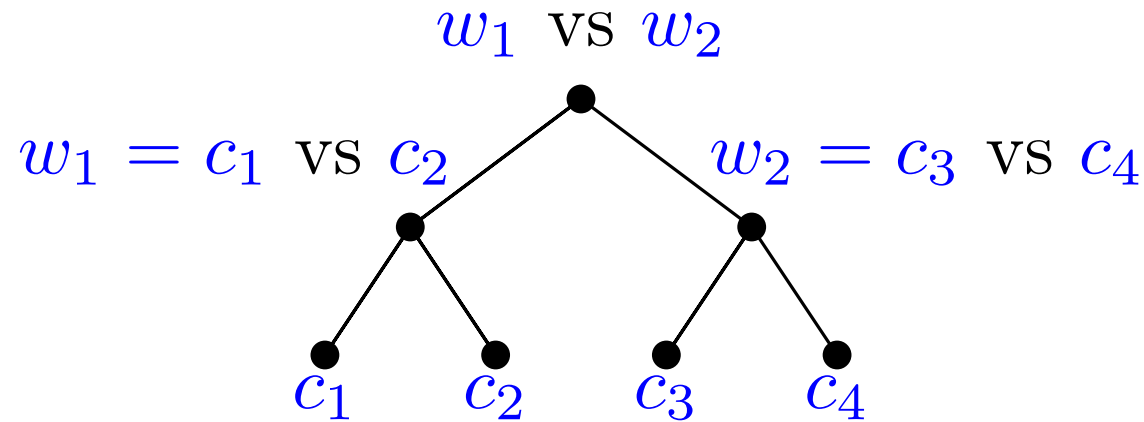


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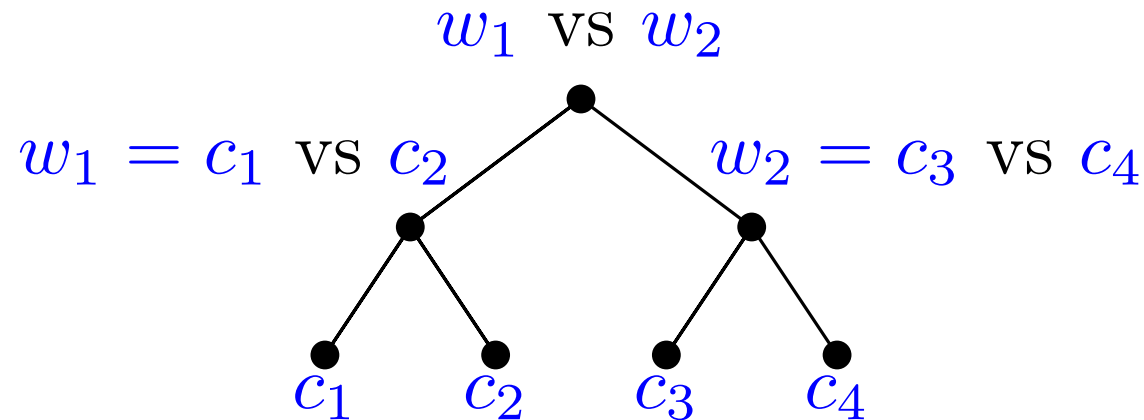
Plurality Consensus via Tournament Tree

Idea. Compute plurality by *majority* tournament.



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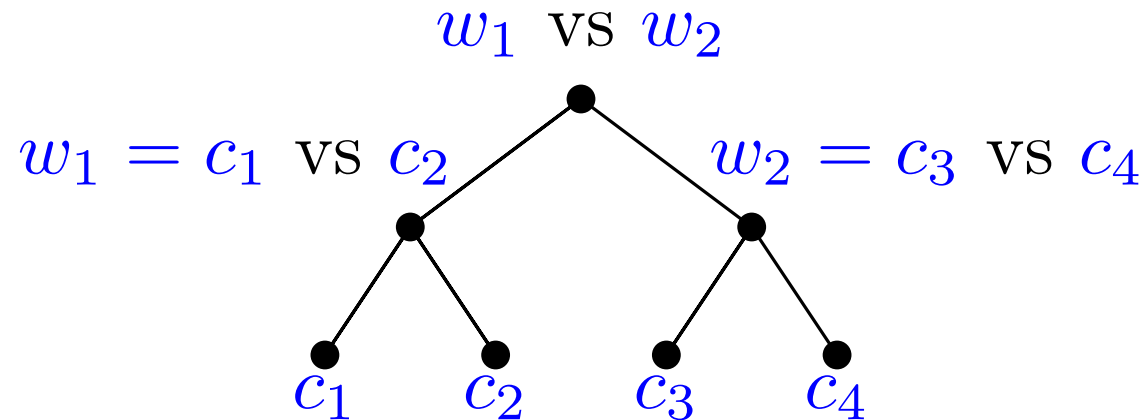
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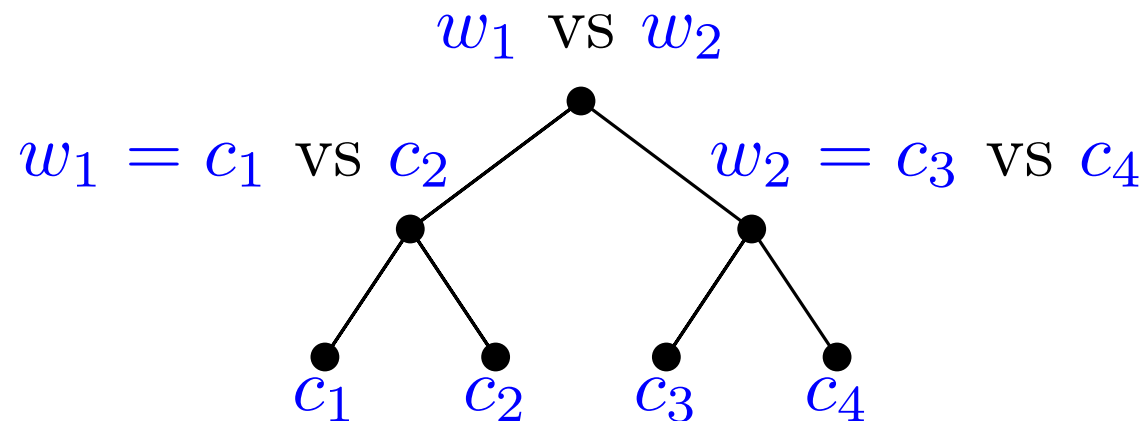


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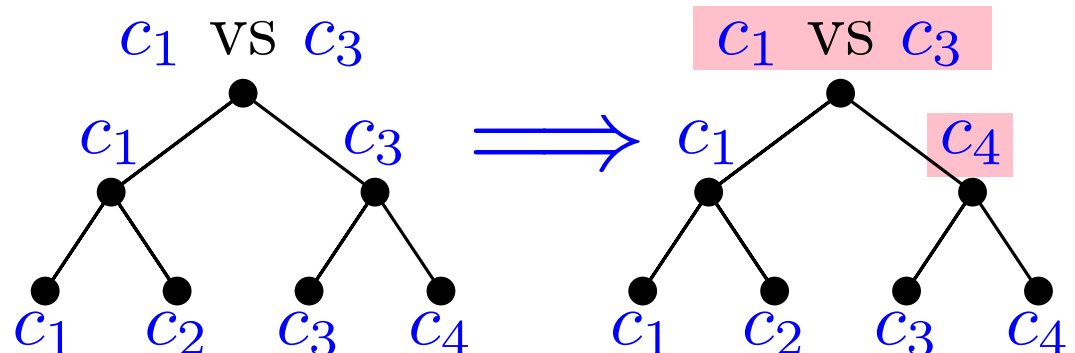
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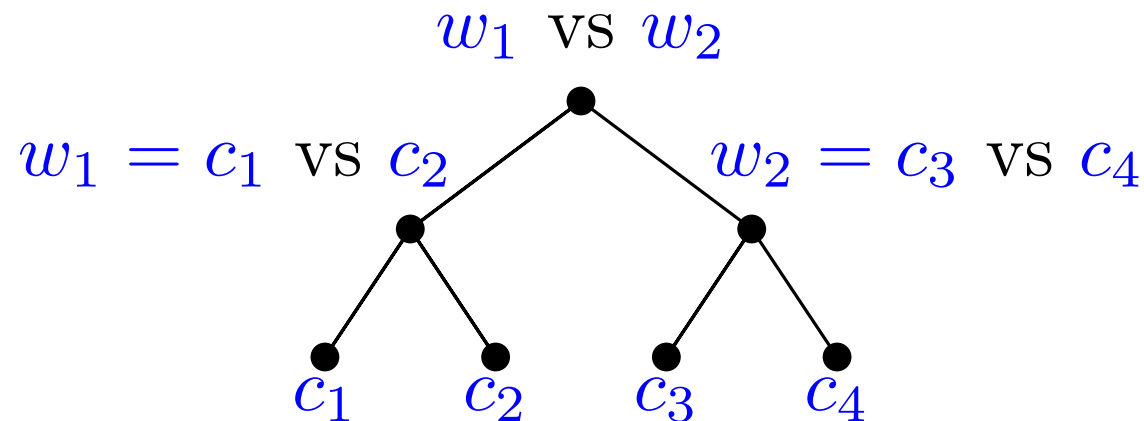
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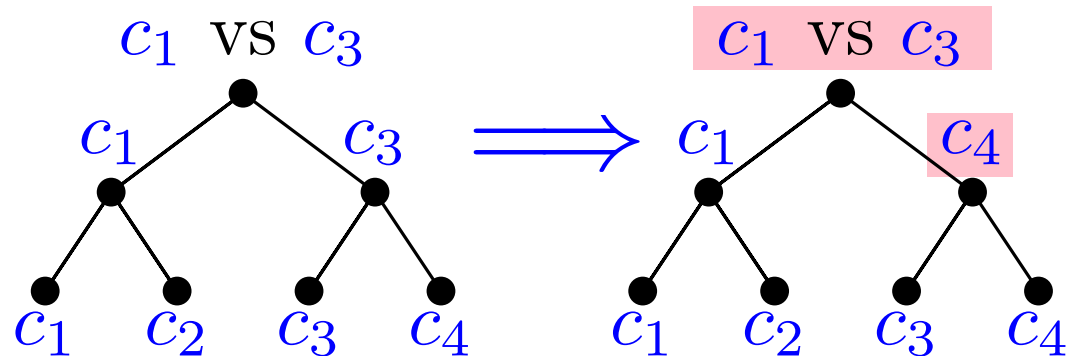


Requires agreement on the leaves/labels.

Problem. Not clear who should play at each match: winner of previous matches can change.

Solved if nodes can change *opinion*.

c_1 may already have been competing against c_4 : it cannot simply start afresh



Dynamic Plurality Consensus

[Gasieniec et al. OPODIS'16]

Nodes can *change opinion* during execution.

States and weights

s	$w(s)$
$[-2]$	-2
$[-1]$	-1
$[0], \langle -1 \rangle, \langle 0 \rangle, \langle 1 \rangle$	0
$[1]$	1
$[2]$	2

Updating the state

$s_a, c_a = 1$ changes to $c'_a = -1$	s'_a
$[0], \langle -1 \rangle, \langle 0 \rangle, \langle 1 \rangle$	$[-2]$
$[1]$	$[-1]$
$[2]$	$[0]$
$s_a, c_a = -1$ changes to $c'_a = 1$	s'_a
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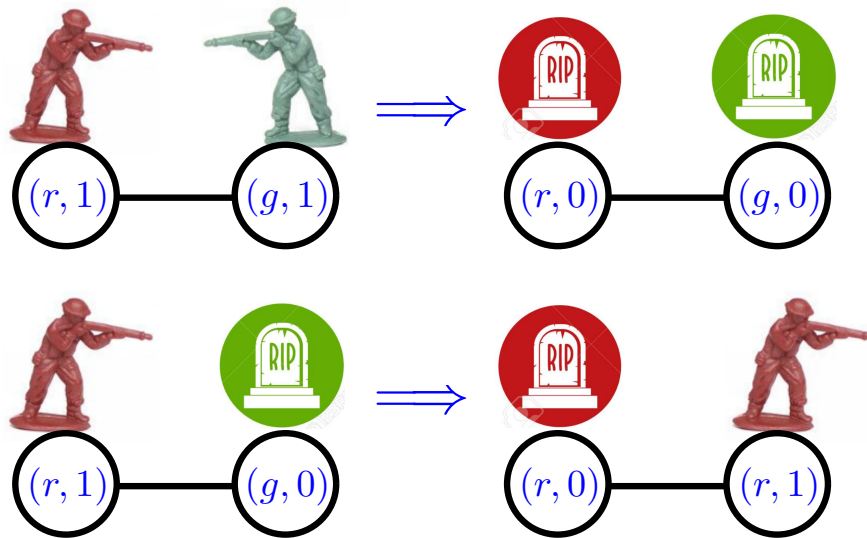
Transitions

$s_a \setminus s_b$	$[-2]$	$[-1]$	$[0]$	$[1]$	$[2]$
$[-2]$	$([-2], [-2])$	$([-2], [-1])$	$([-2], \langle -1 \rangle)$	$([-1], \langle -1 \rangle)$	$([0], [0])$
$[-1]$	$([-1], [-2])$	$([-1], [-1])$	$([-1], \langle -1 \rangle)$	$([0], [0])$	$(\langle 1 \rangle, [1])$
$[0]$	$(\langle -1 \rangle, [-2])$	$(\langle -1 \rangle, [-1])$	$([0], [0])$	$(\langle 1 \rangle, [1])$	$(\langle 1 \rangle, [2])$
$[1]$	$(\langle -1 \rangle, [-1])$	$([0], [0])$	$(\langle 1 \rangle, [1])$	$([1], [1])$	$([1], [2])$
$[2]$	$([0], [0])$	$([1], \langle 1 \rangle)$	$([2], \langle 1 \rangle)$	$([2], [1])$	$([2], [2])$
weak	$(\langle -1 \rangle, [-2])$	$(\langle -1 \rangle, [-1])$	$(\langle 0 \rangle, [0])$	$(\langle 1 \rangle, [1])$	$(\langle 1 \rangle, [2])$

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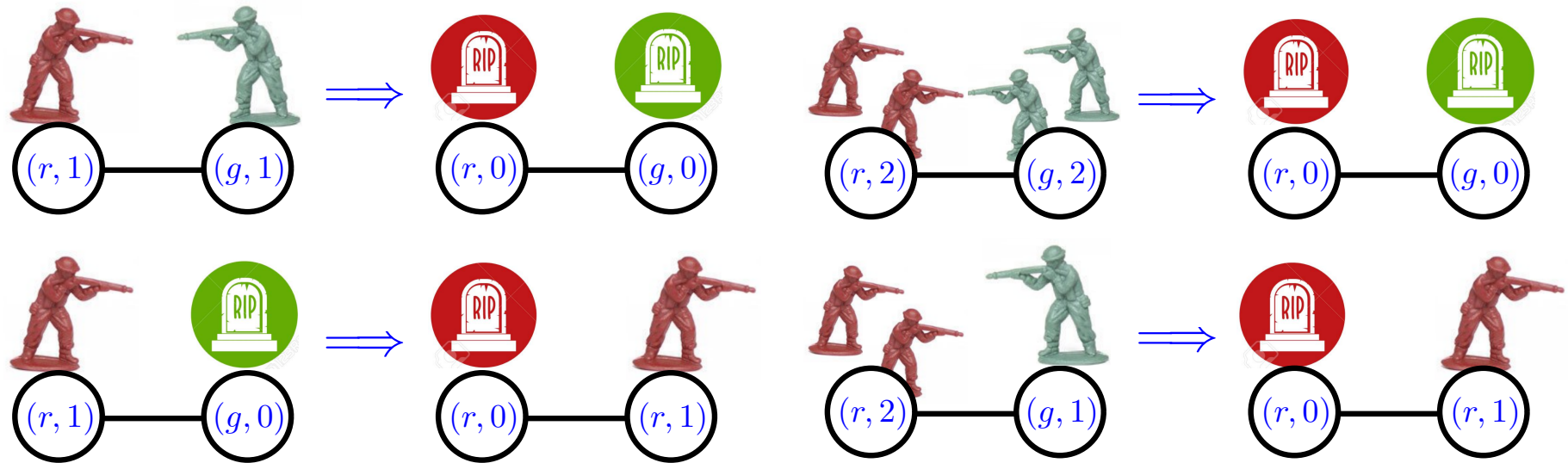
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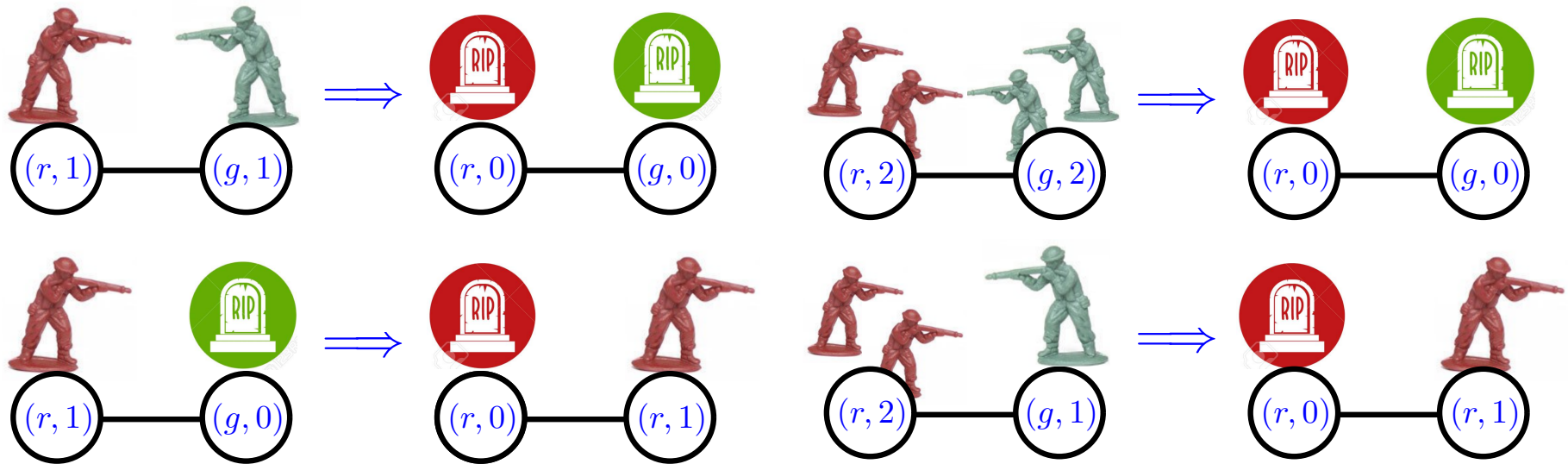
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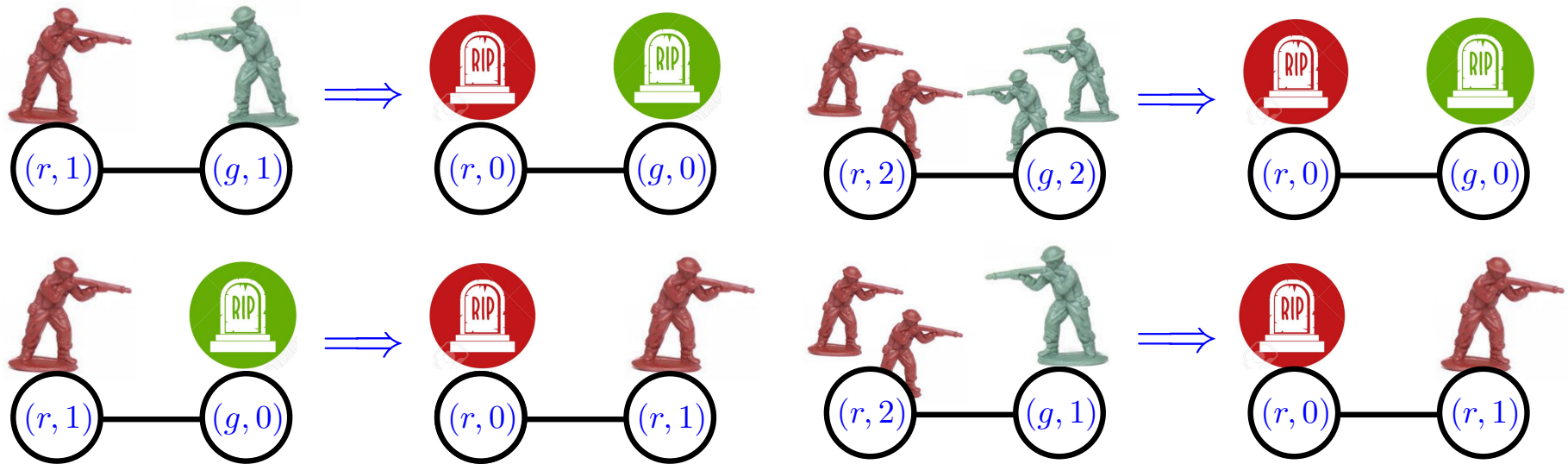


Nodes changing opinion generate *two* soldiers of the new opinion.

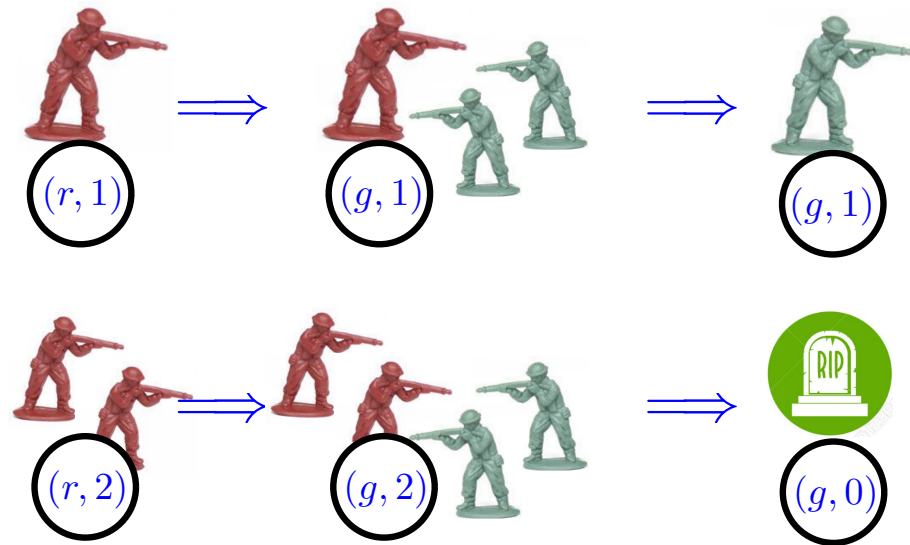
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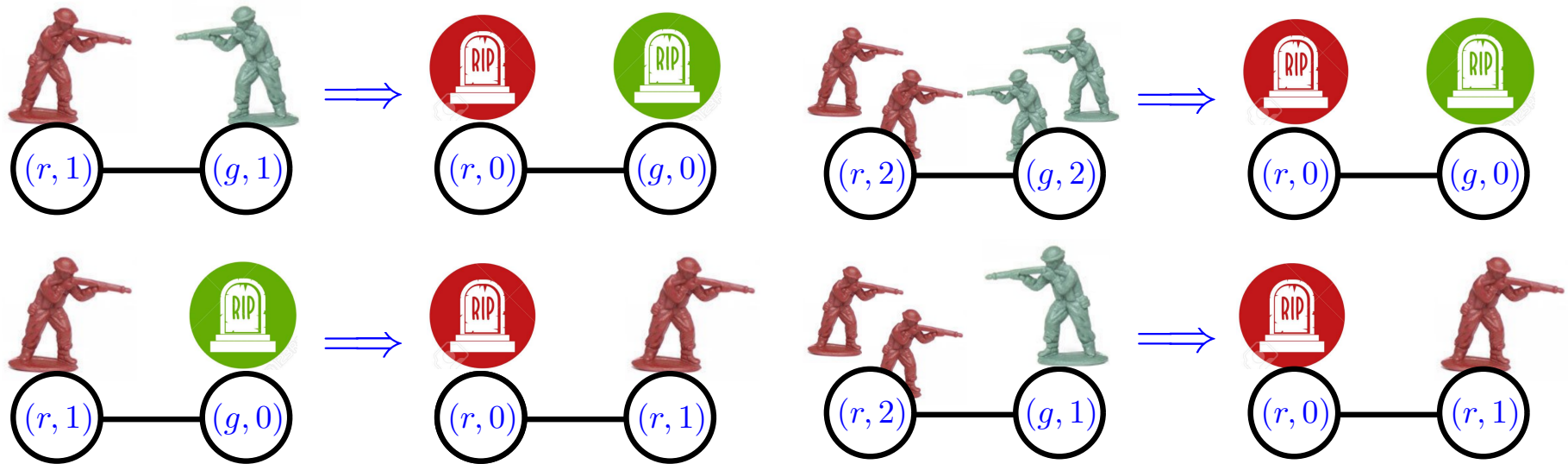
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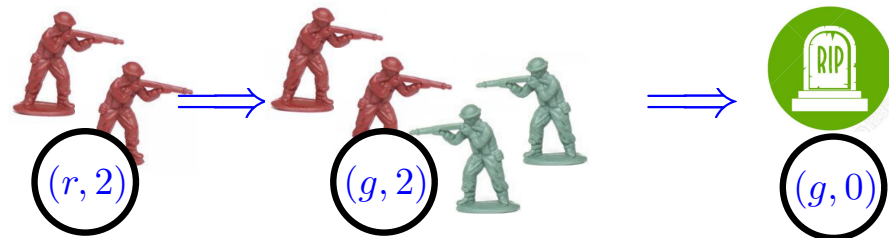
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Balance of opinions
equals
balance of soldiers



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$O(k^{11})$ Upper Bound (Refuting Conjecture)

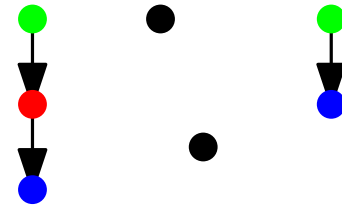
To refute Salehkeleybar's conjecture we provide a protocol that *creates a labeling* and can run *in parallel* with Gasieniec et al.'s.

$O(k^{11})$ Upper Bound (Refuting Conjecture)

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Idea. Have agents arrange opinions in a linked list.

Problem. Multiple lists can appear. How to delete/merge lists?

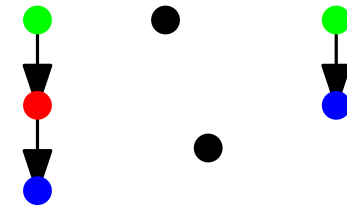


$O(k^{11})$ Upper Bound (Refuting Conjecture)

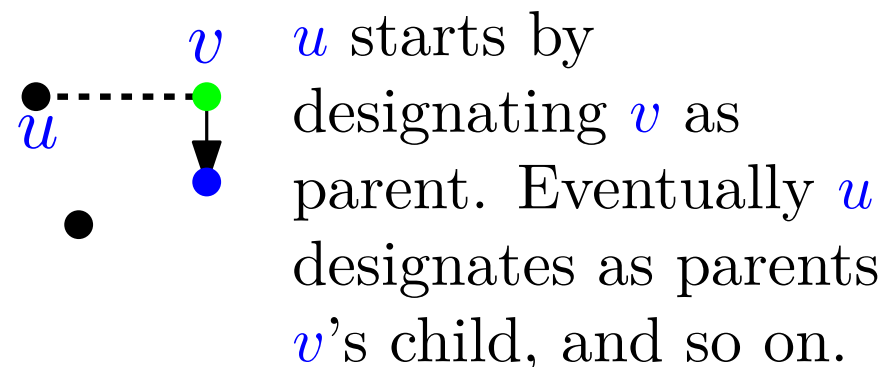
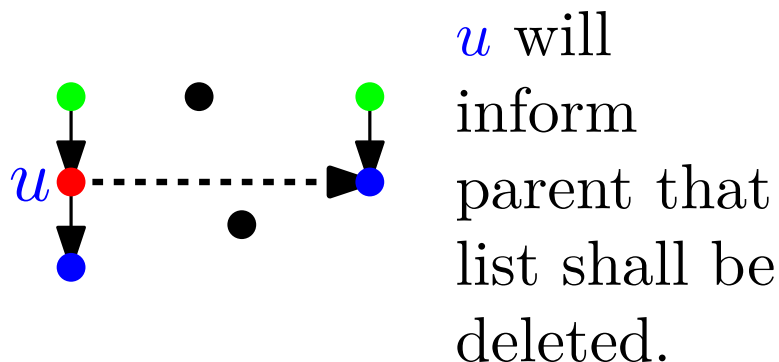
To refute Salehkeybar's conjecture we provide a protocol that *creates a labeling* and can run *in parallel* with Gasieniec et al.'s.

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Ideas. Start deleting from *roots* of lists and append elements by travelling from root to last item.



Open Problem

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What is the space complexity of plurality consensus in population protocols with fair scheduler?



Thank You