

# Computing with Large Populations

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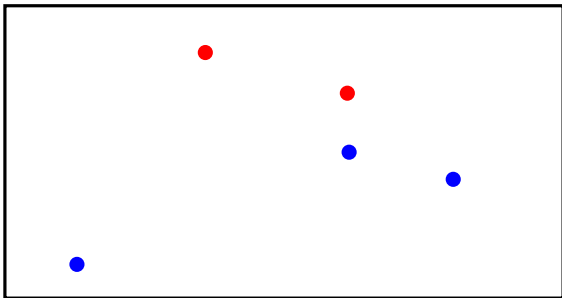
# Inspiration: (classical) Population Protocols

Introduced by [Angluin, Aspnes, Diamadi, Fischer, Peralta 2004] in the context of distributed systems.

A model of anonymous (sensor) networks with absolutely minimal assumptions about

- sophistication of mobile units: finite state machines
- infrastructure: none (not even unique ids)
- synchrony: totally asynchronous
- communication range: big enough that communication is occasionally possible between two agents.

# Example 1: starting with 3 blues, 2red



Program:

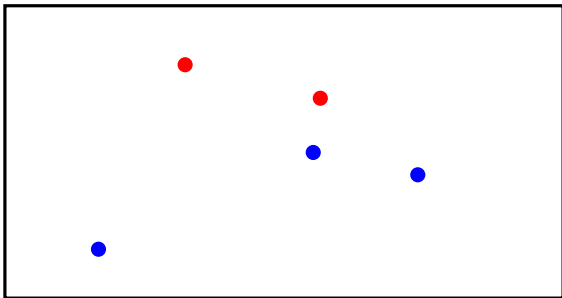
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## Example 1: starting with 3 blues, 2red



Program:

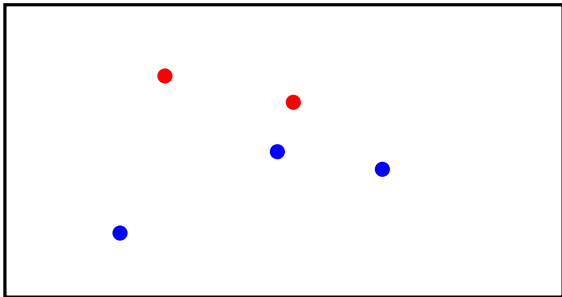
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## Example 1: starting with 3 blues, 2red



Program:

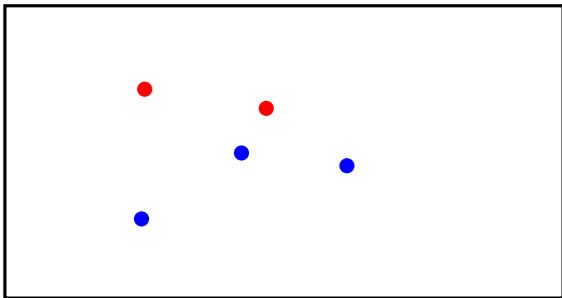
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## Example 1: starting with 3 blues, 2red



Program:

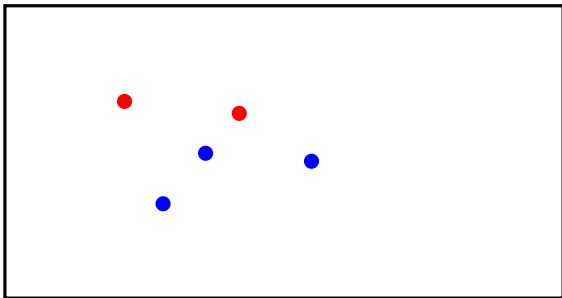
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# Example 1: starting with 3 blues, 2red



Program:

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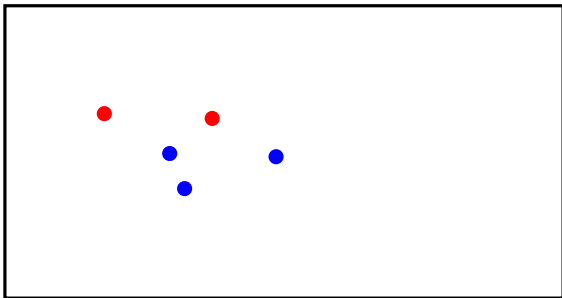
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## Example 1: starting with 3 blues, 2red



Program:

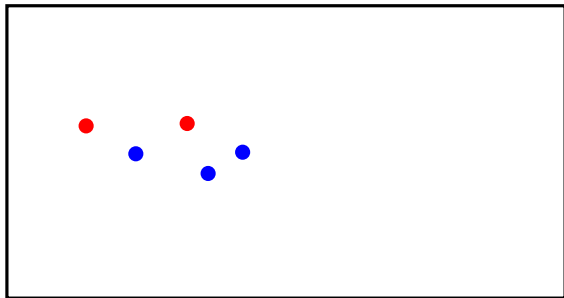
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## Example 1: starting with 3 blues, 2red



Program:

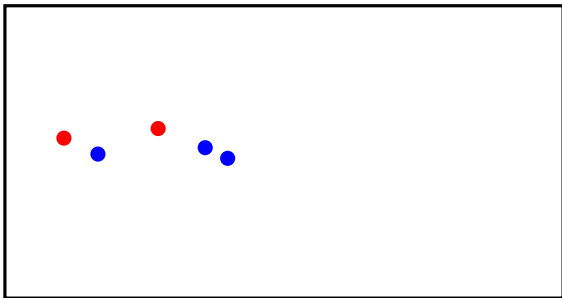
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## Example 1: starting with 3 blues, 2red



Program:

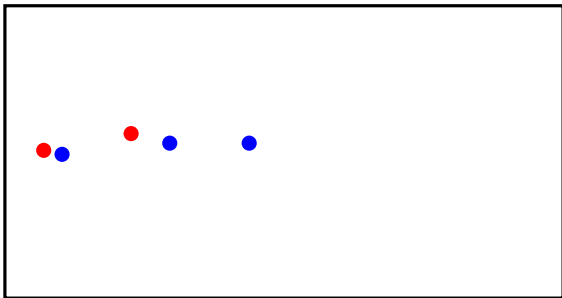
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# Example 1: starting with 3 blues, 2red



Program:

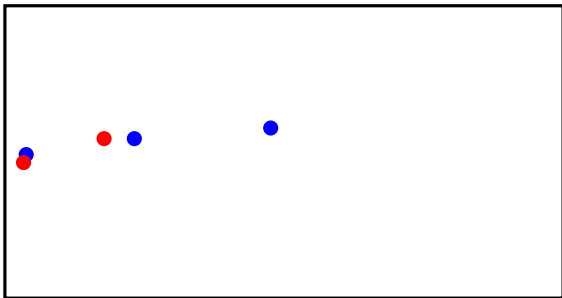
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# Example 1: starting with 3 blues, 2red



Program:

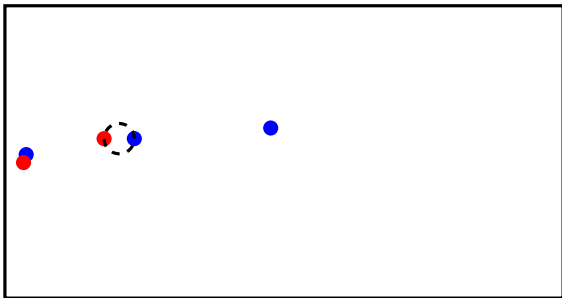
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# Example 1: starting with 3 blues, 2red



Program:

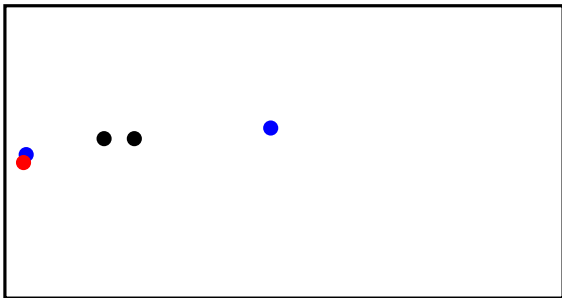
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## Example 1: starting with 3 blues, 2red



Program:

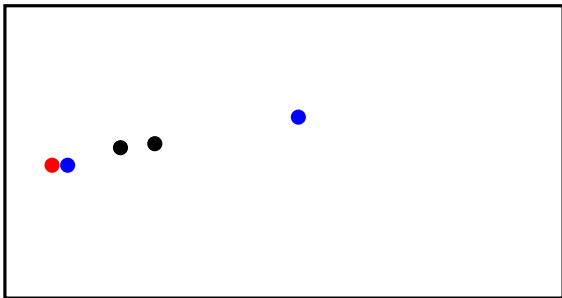
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## Example 1: starting with 3 blues, 2red



Program:

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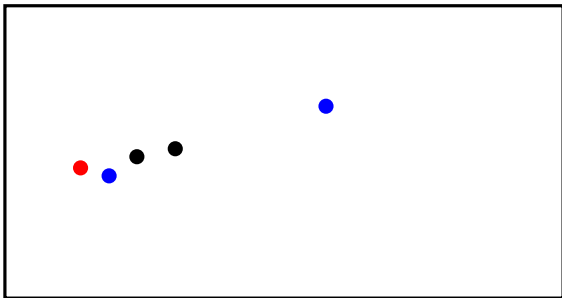
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# Example 1: starting with 3 blues, 2red



Program:

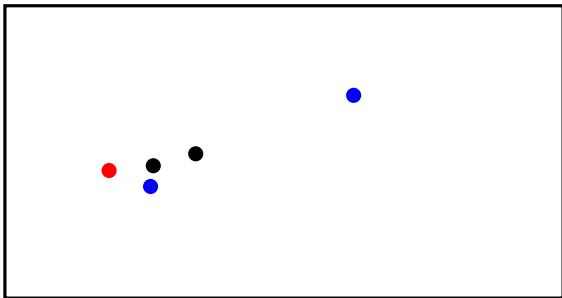
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## Example 1: starting with 3 blues, 2red



Program:

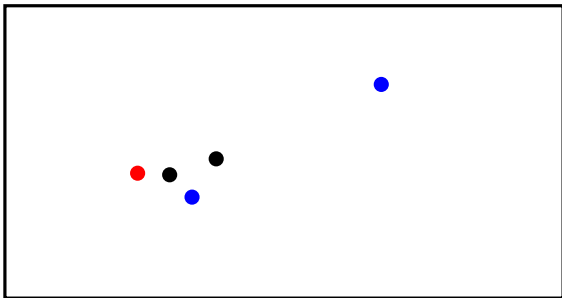
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## Example 1: starting with 3 blues, 2red



Program:

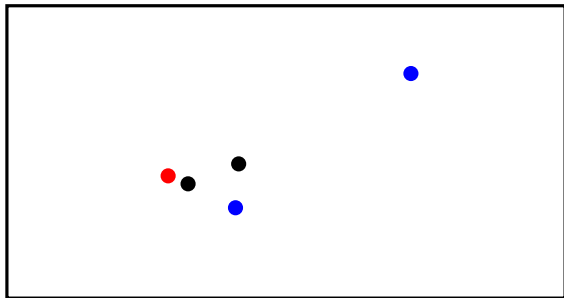
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## Example 1: starting with 3 blues, 2red



Program:

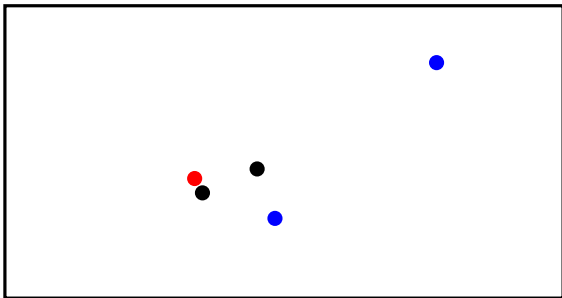
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## Example 1: starting with 3 blues, 2red



Program:

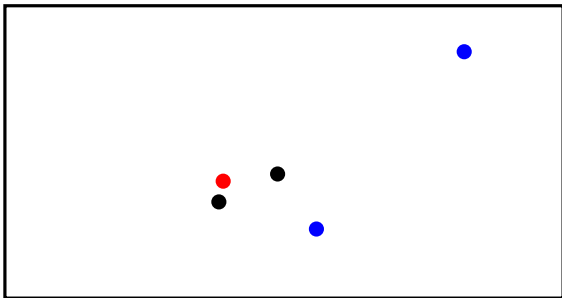
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## Example 1: starting with 3 blues, 2red



Program:

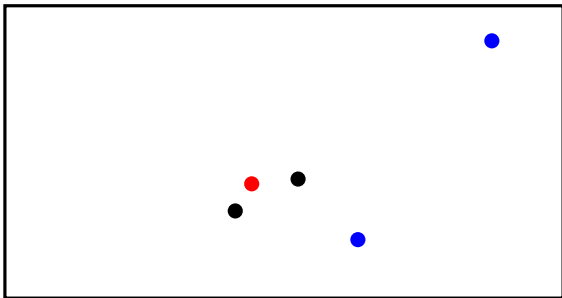
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## Example 1: starting with 3 blues, 2red



Program:

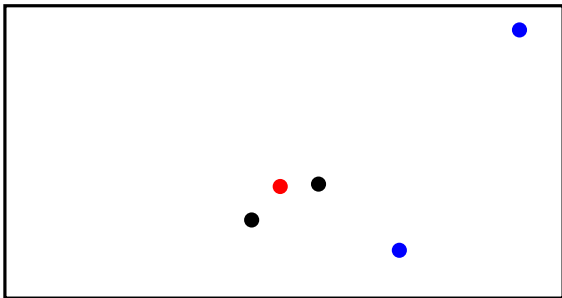
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# Example 1: starting with 3 blues, 2red



Program:

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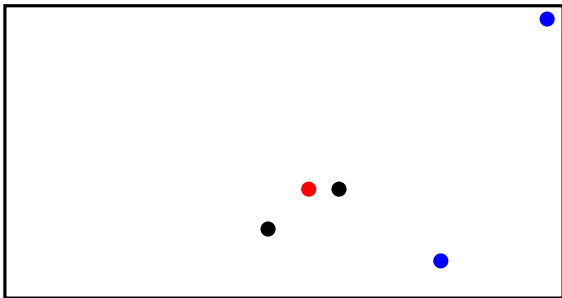
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## Example 1: starting with 3 blues, 2red



Program:

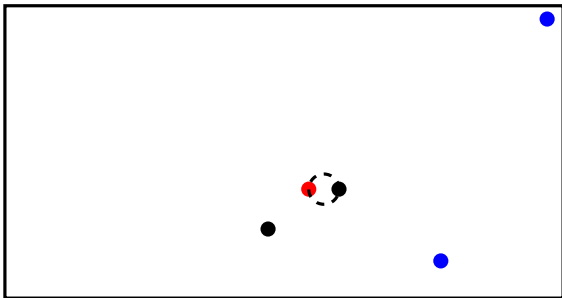
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# Example 1: starting with 3 blues, 2red



Program:

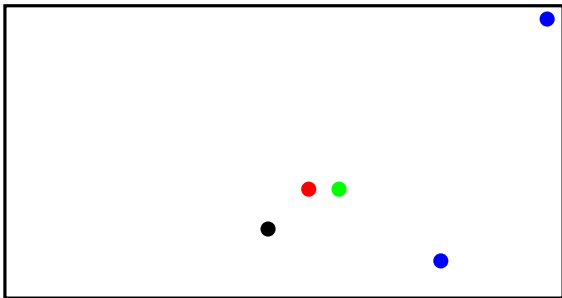
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## Example 1: starting with 3 blues, 2red



Program:

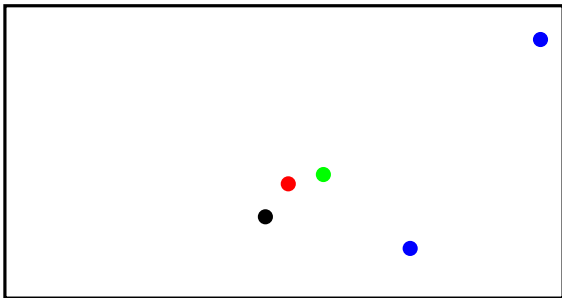
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## Example 1: starting with 3 blues, 2red



Program:

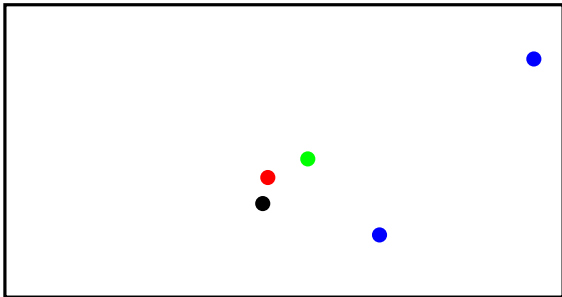
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# Example 1: starting with 3 blues, 2red



Program:

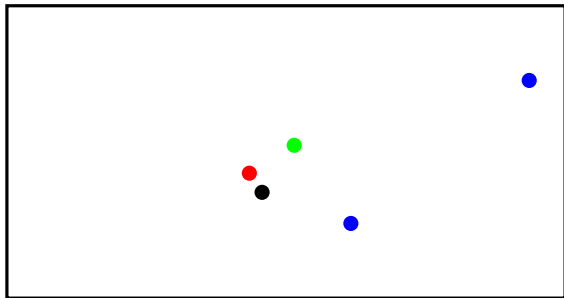
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## Example 1: starting with 3 blues, 2red



Program:

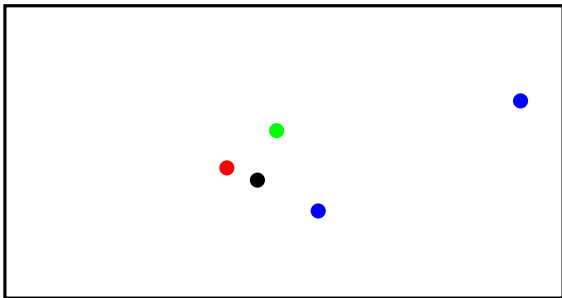
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# Example 1: starting with 3 blues, 2red



Program:

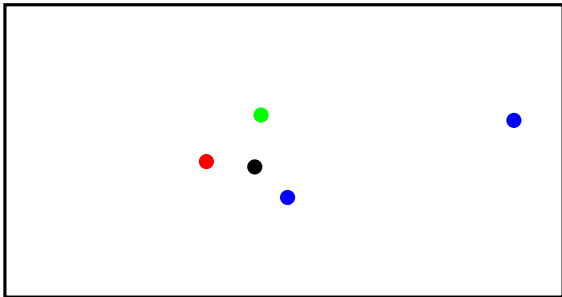
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# Example 1: starting with 3 blues, 2red



Program:

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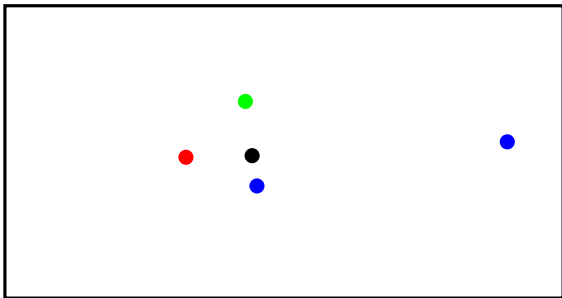
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# Example 1: starting with 3 blues, 2red



Program:

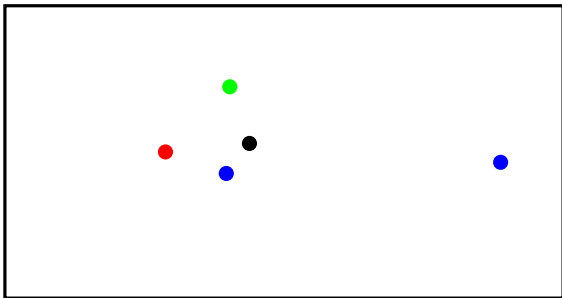
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# Example 1: starting with 3 blues, 2red



Program:

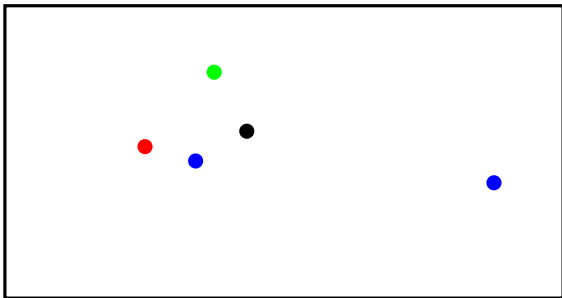
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## Example 1: starting with 3 blues, 2red



Program:

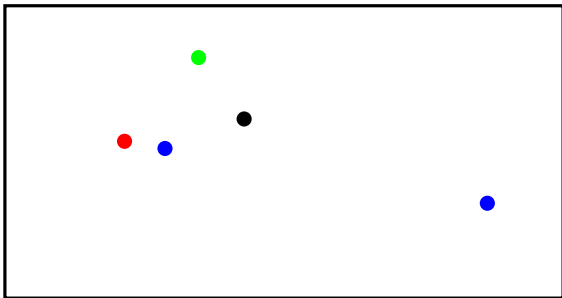
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# Example 1: starting with 3 blues, 2red



Program:

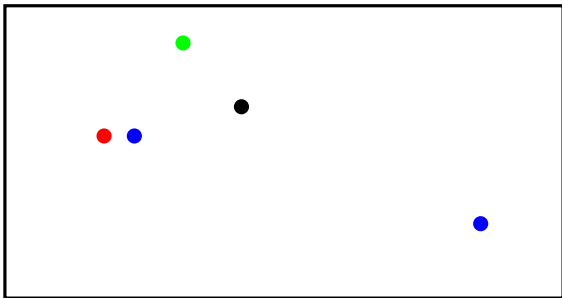
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# Example 1: starting with 3 blues, 2red



Program:

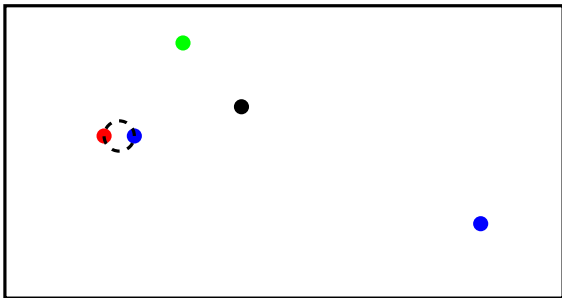
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# Example 1: starting with 3 blues, 2red



Program:

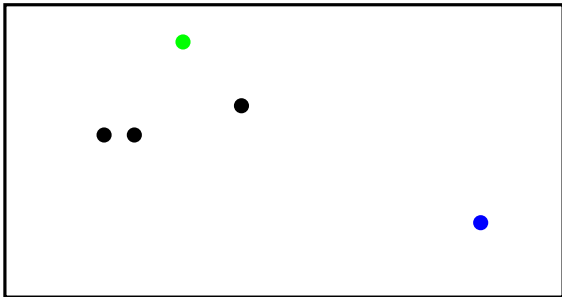
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# Example 1: starting with 3 blues, 2red



Program:

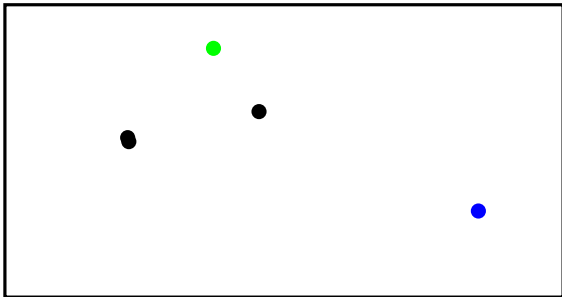
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# Example 1: starting with 3 blues, 2red



Program:

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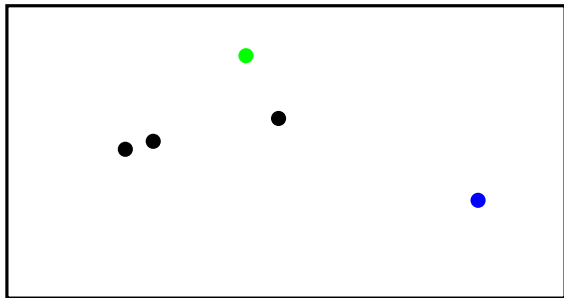
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# Example 1: starting with 3 blues, 2red



Program:

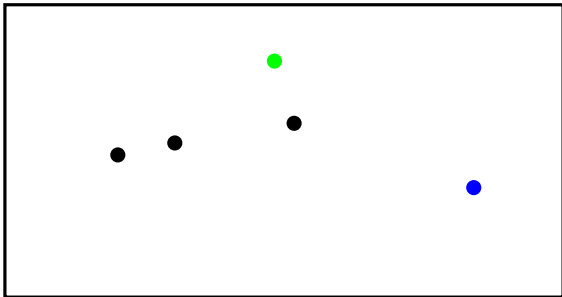
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# Example 1: starting with 3 blues, 2red



Program:

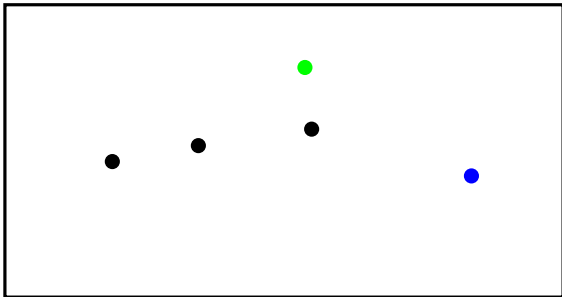
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# Example 1: starting with 3 blues, 2red



Program:

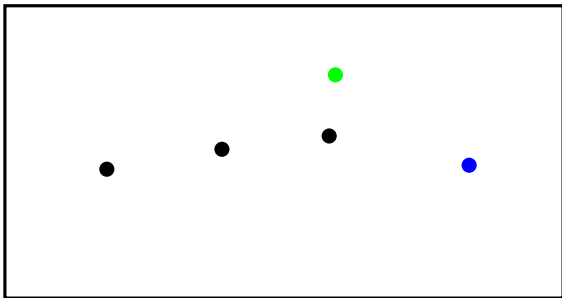
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# Example 1: starting with 3 blues, 2red



Program:

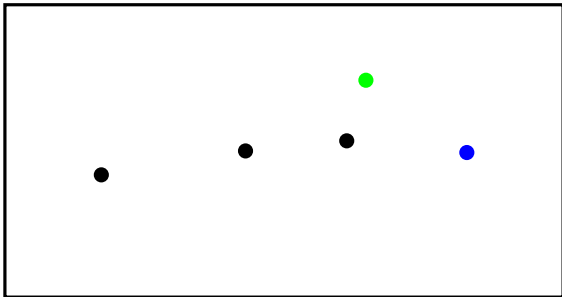
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# Example 1: starting with 3 blues, 2red



Program:

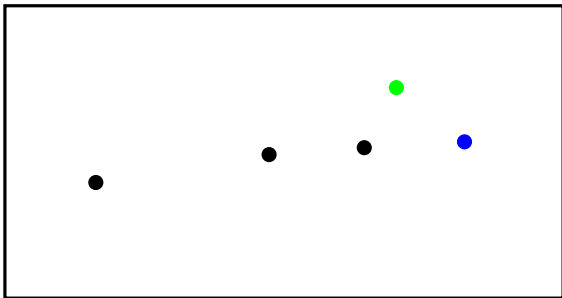
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# Example 1: starting with 3 blues, 2red



Program:

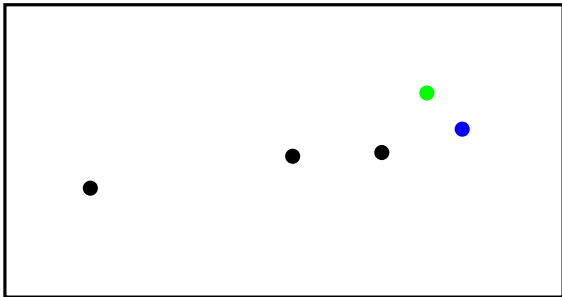
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# Example 1: starting with 3 blues, 2red



Program:

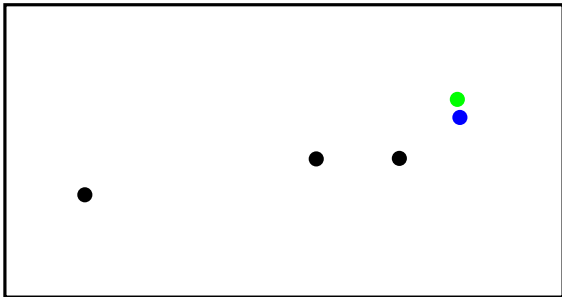
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# Example 1: starting with 3 blues, 2red



Program:

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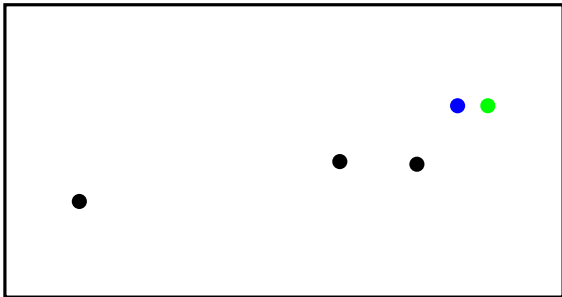
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# Example 1: starting with 3 blues, 2red



Program:

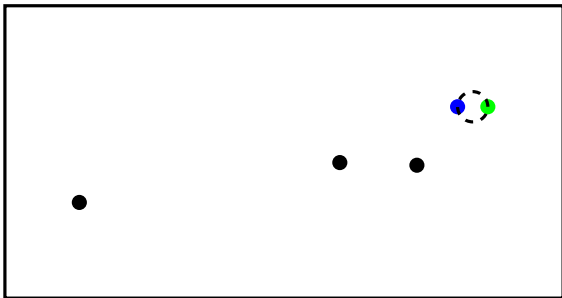
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# Example 1: starting with 3 blues, 2red



Program:

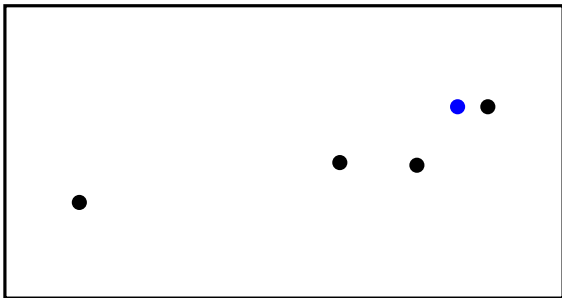
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## Example 1: starting with 3 blues, 2red



Program:

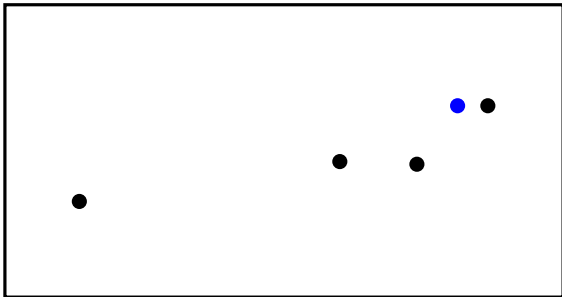
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## Example 1: Final result



Program:

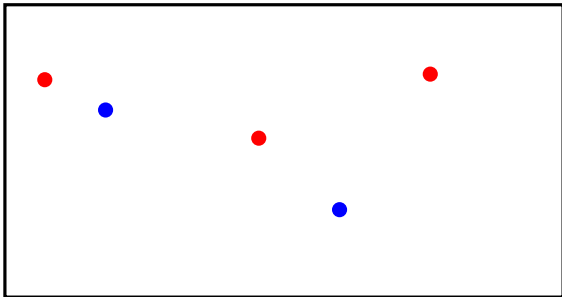
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## Example 2: starting with 2 blues, 3red



Program:

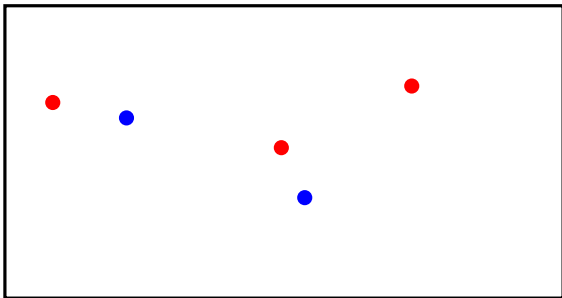
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## Example 2: starting with 2 blues, 3red



Program:

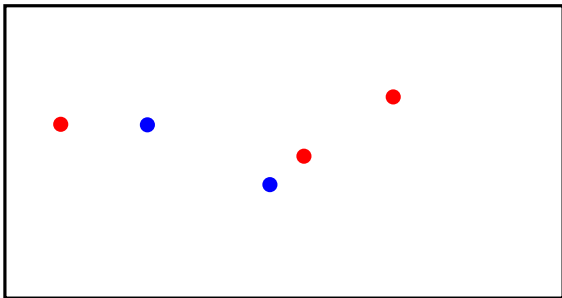
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## Example 2: starting with 2 blues, 3red



Program:

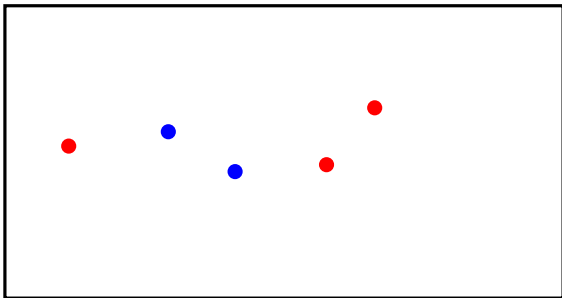
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## Example 2: starting with 2 blues, 3red



Program:

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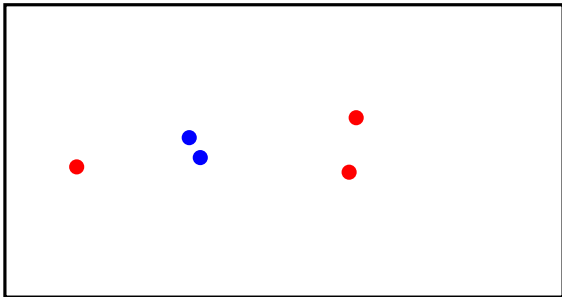
● ● → ● ●

● ● → ● ●

● ● → ● ●



## Example 2: starting with 2 blues, 3red



Program:

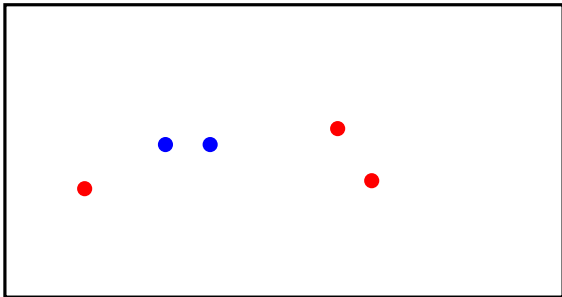
● ● → ● ●

● ● → ● ●

● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

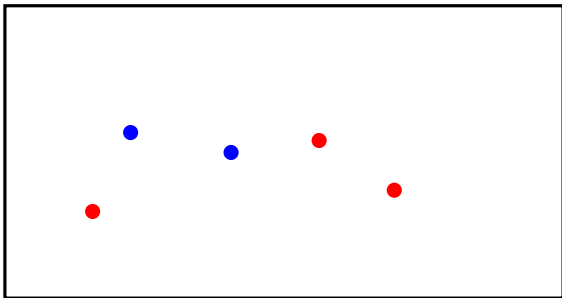
● ● → ● ●

● ● → ● ●

● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

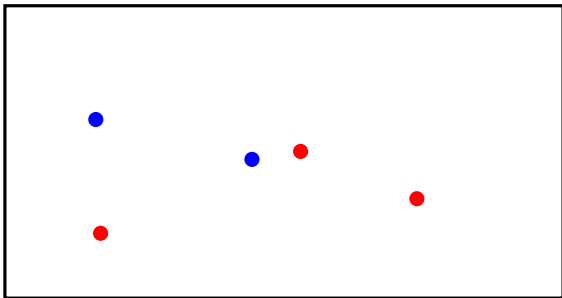
● ● → ● ●

● ● → ● ●

● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

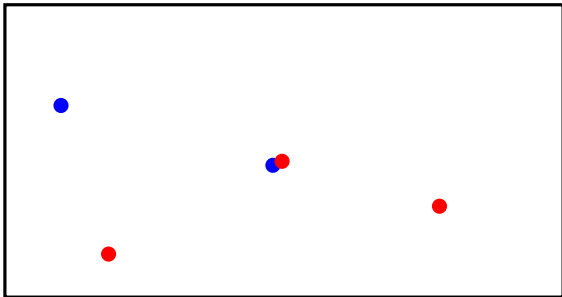
● ● → ● ●

● ● → ● ●

● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

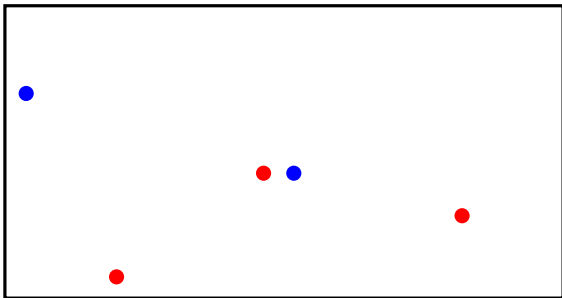
● ● → ● ●

● ● → ● ●

● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

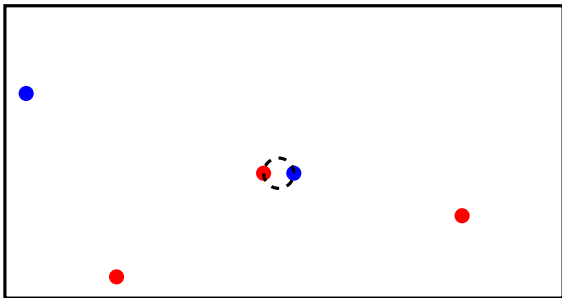
● ● → ● ●

● ● → ● ●

● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

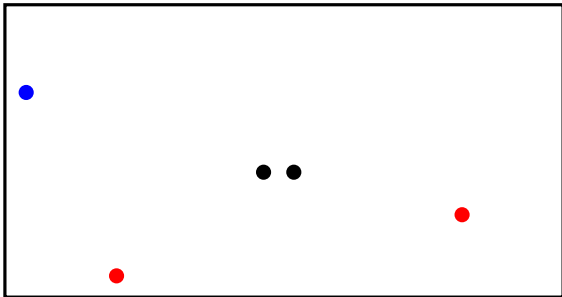
● ● → ● ●

● ● → ● ●

● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

● ● → ● ●

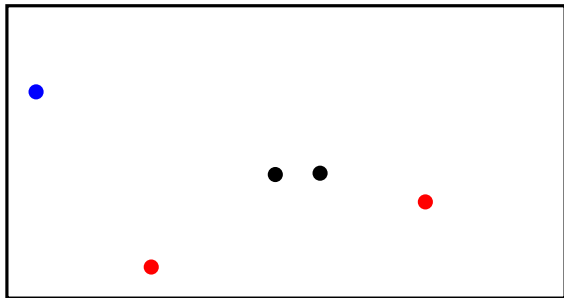
● ● → ● ●

● ● → ● ●

● ● → ● ●



## Example 2: starting with 2 blues, 3red



Program:

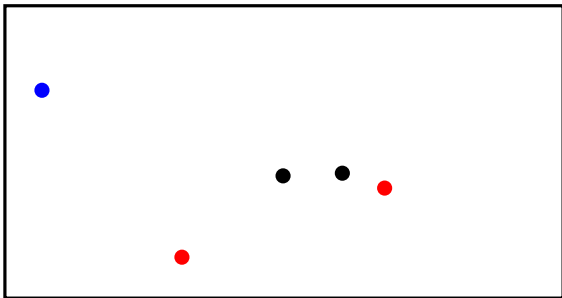
● ● → ● ●

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● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

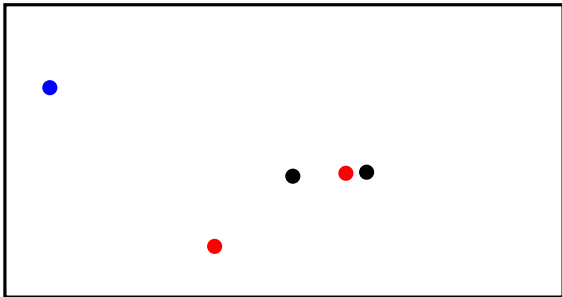
● ● → ● ●

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● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

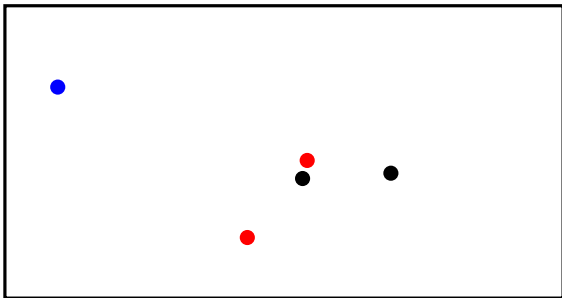
● ● → ● ●

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● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

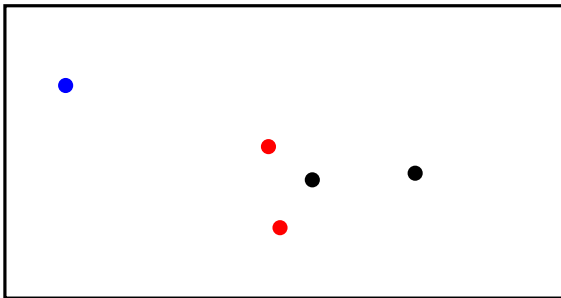
● ● → ● ●

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● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

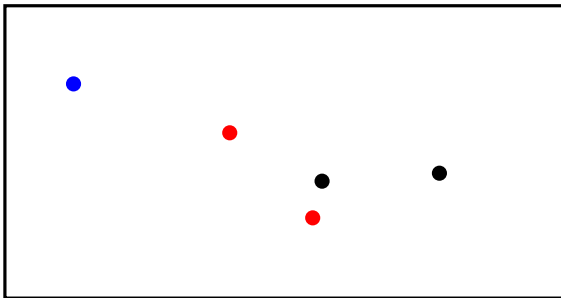
● ● → ● ●

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● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

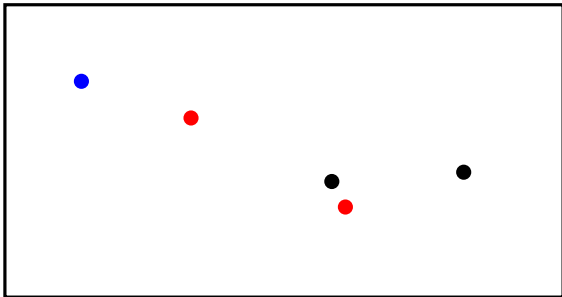
● ● → ● ●

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● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

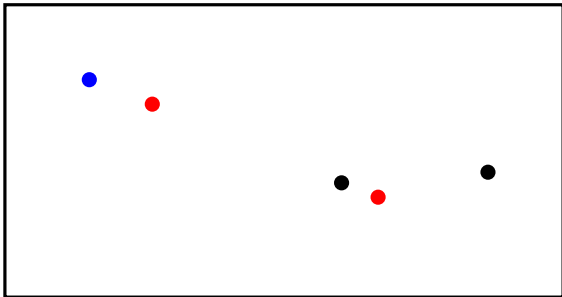
● ● → ● ●

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● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

● ● → ● ●

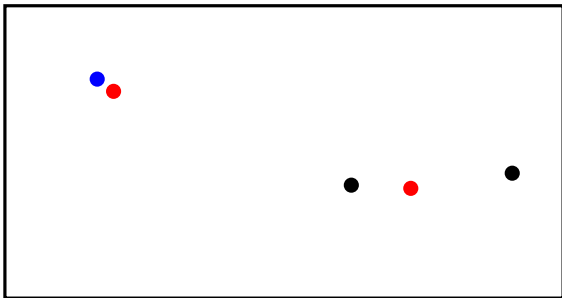
● ● → ● ●

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● ● → ● ●



## Example 2: starting with 2 blues, 3red



Program:

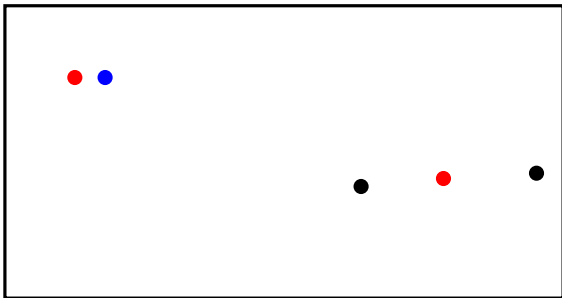
● ● → ● ●

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● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

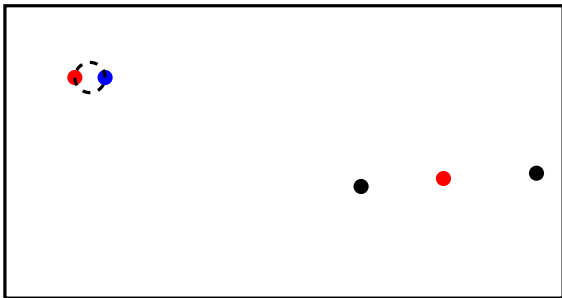
● ● → ● ●

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● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

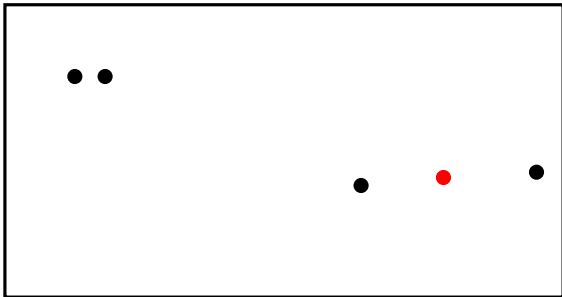
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● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

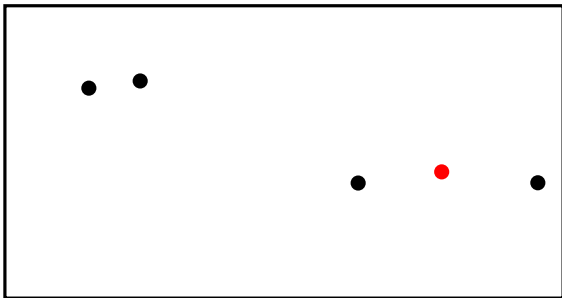
● ● → ● ●

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● ● → ● ●

● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

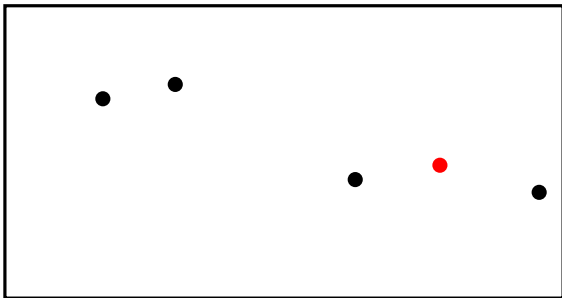
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

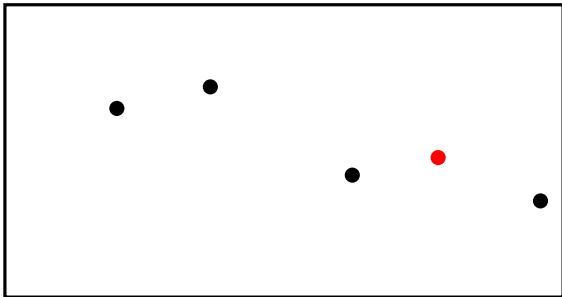
● ● → ● ●

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● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

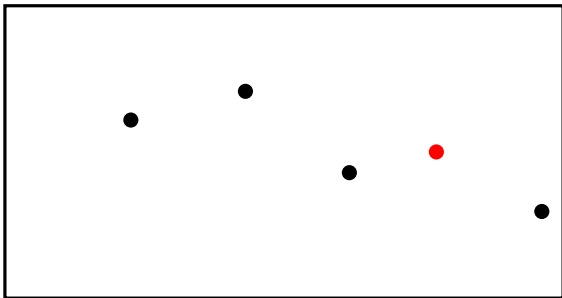
● ● → ● ●

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● ● → ● ●

## Example 2: starting with 2 blues, 3 red



Program:

● ● → ● ●

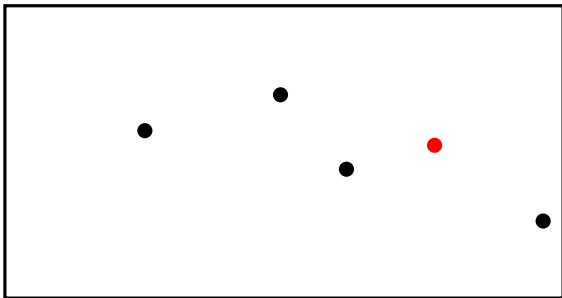
● ● → ● ●

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● ● → ● ●



## Example 2: starting with 2 blues, 3 red



Program:

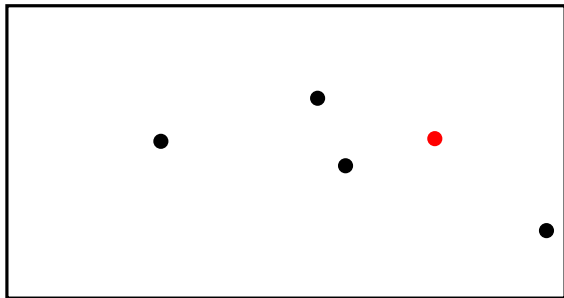
● ● → ● ●

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## Example 2: starting with 2 blues, 3 red



Program:

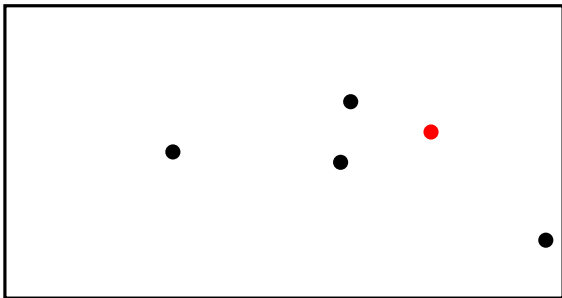
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

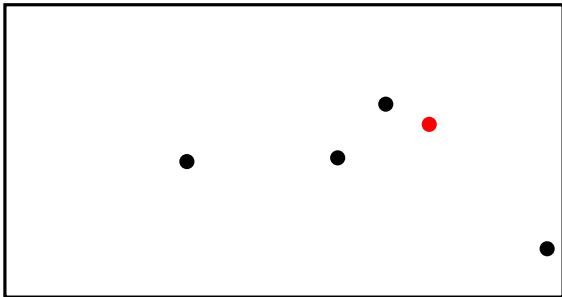
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

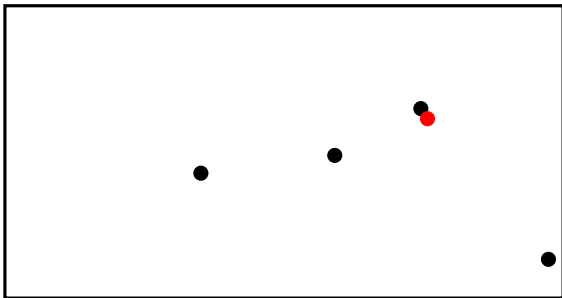
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

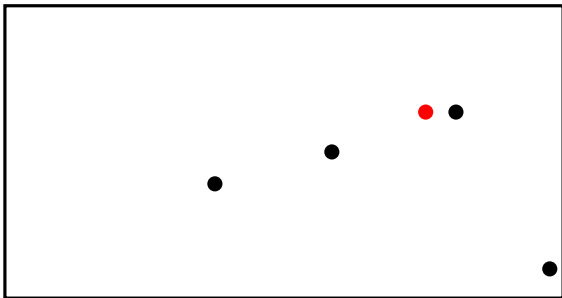
● ● → ● ●

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## Example 2: starting with 2 blues, 3 red



Program:

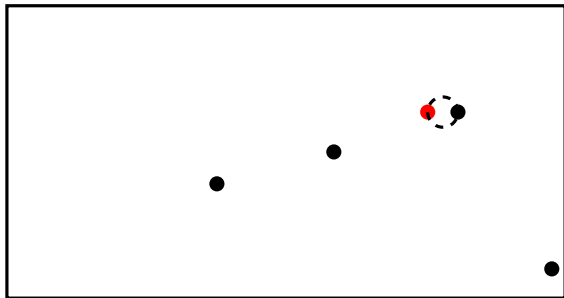
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

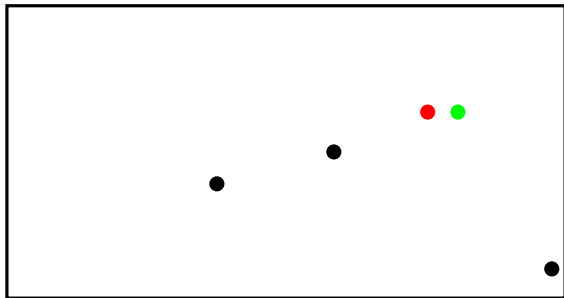
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

● ● → ● ●

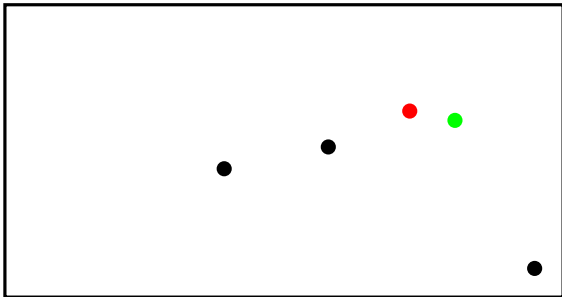
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

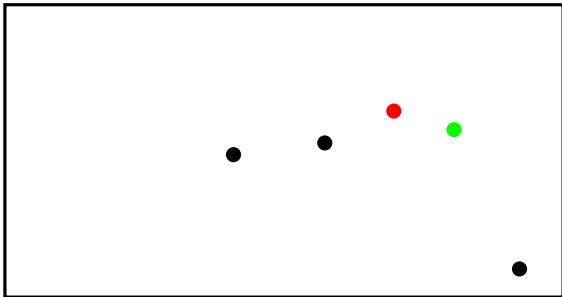
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

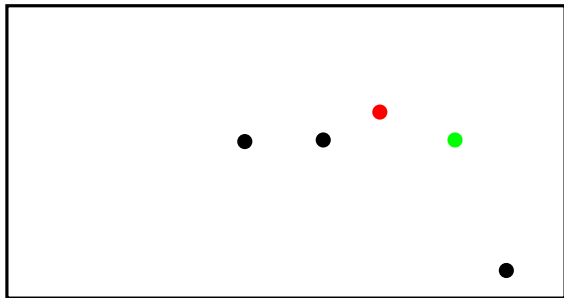
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

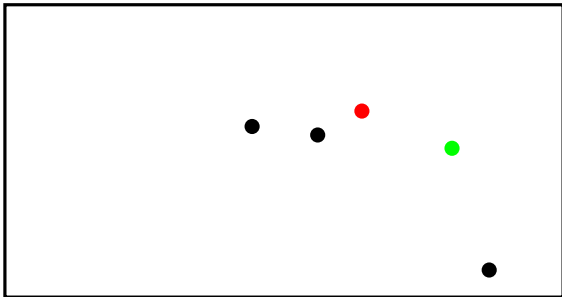
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## Example 2: starting with 2 blues, 3red



Program:

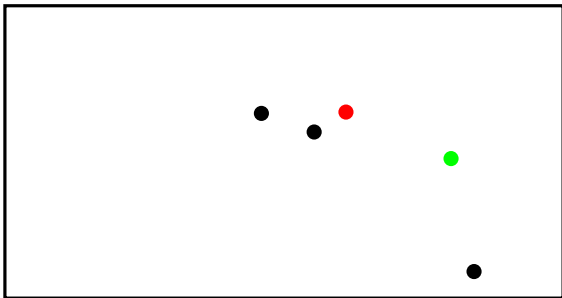
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

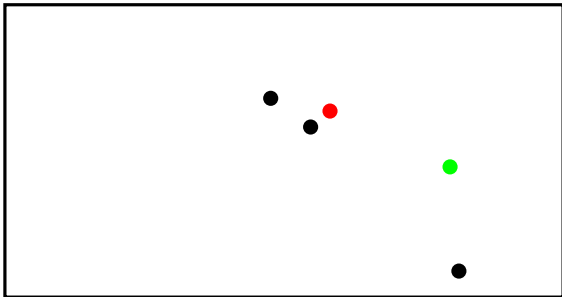
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

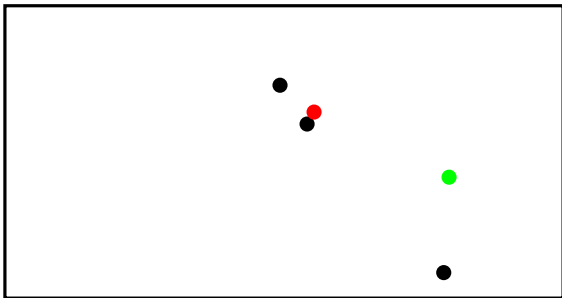
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

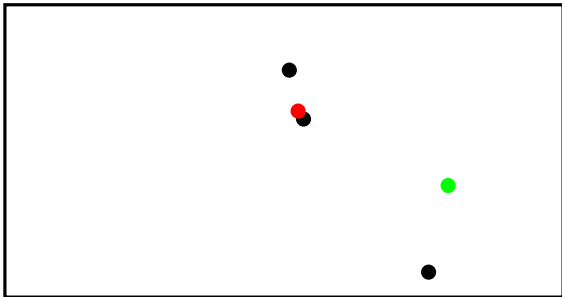
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## Example 2: starting with 2 blues, 3red



Program:

● ● → ● ●

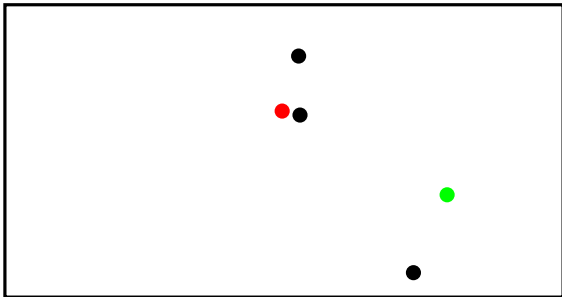
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

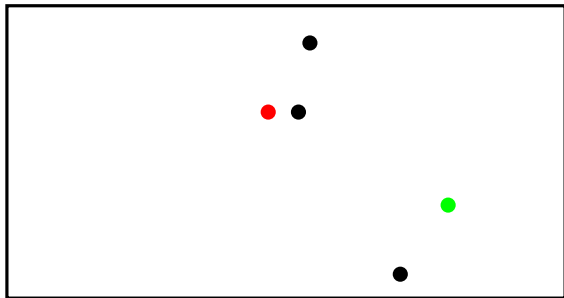
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

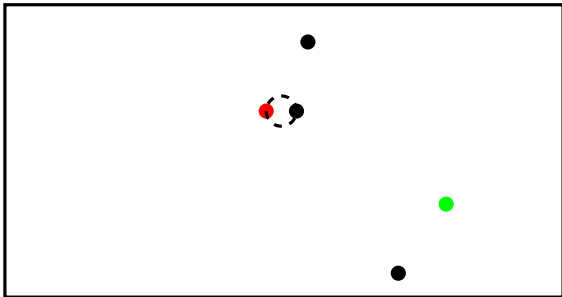
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## Example 2: starting with 2 blues, 3red



Program:

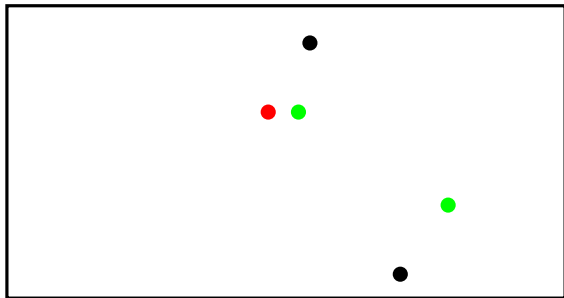
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## Example 2: starting with 2 blues, 3red



Program:

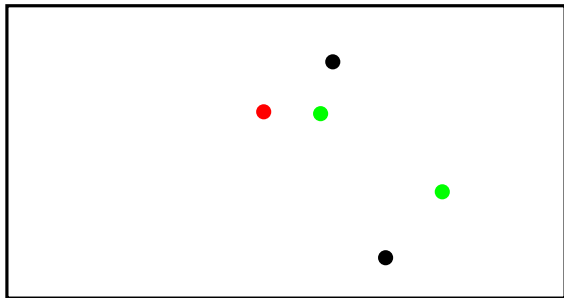
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

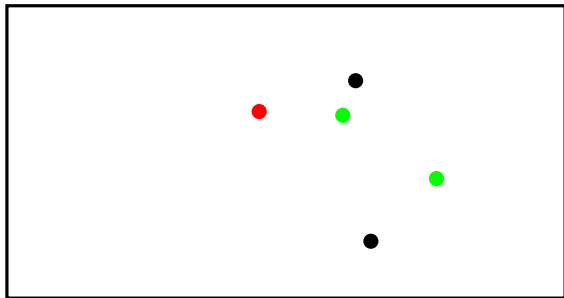
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

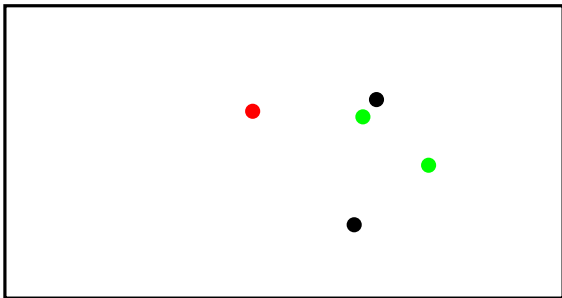
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

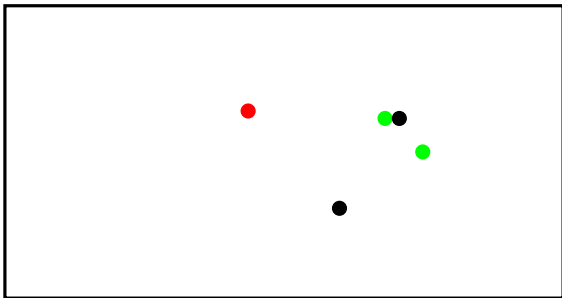
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

● ● → ● ●

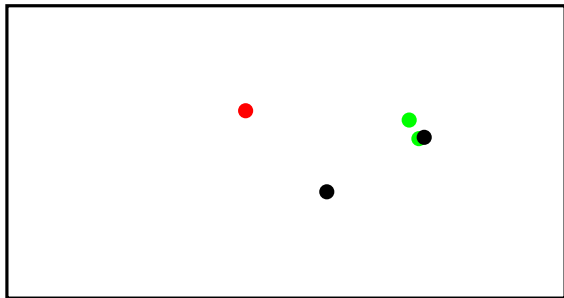
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## Example 2: starting with 2 blues, 3red



Program:

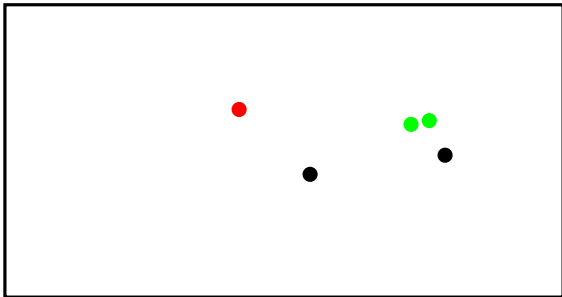
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

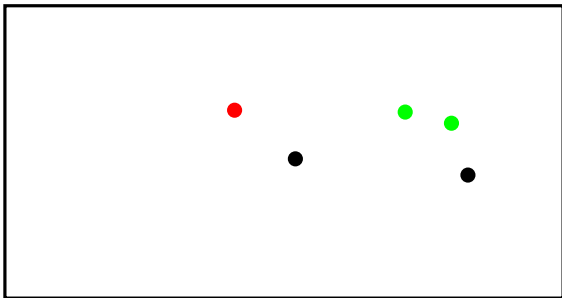
● ● → ● ●

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● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

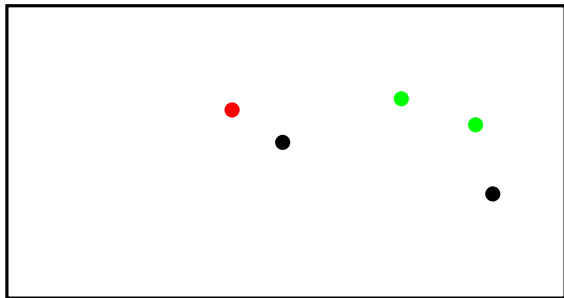
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

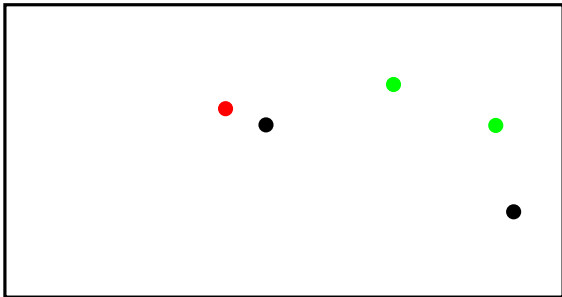
● ● → ● ●

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## Example 2: starting with 2 blues, 3red



Program:

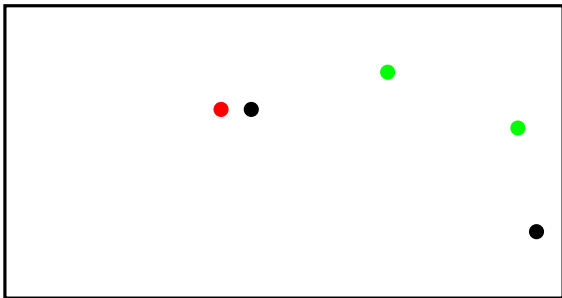
● ● → ● ●

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● ● → ● ●

## Example 2: starting with 2 blues, 3red



Program:

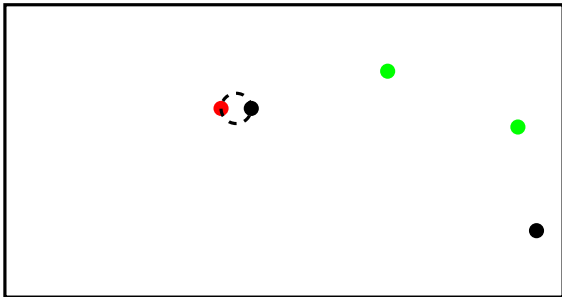
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## Example 2: starting with 2 blues, 3red



Program:

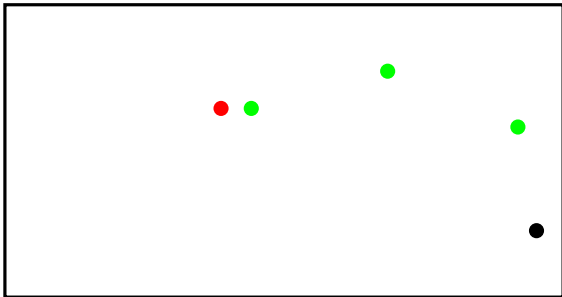
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## Example 2: starting with 2 blues, 3red



Program:

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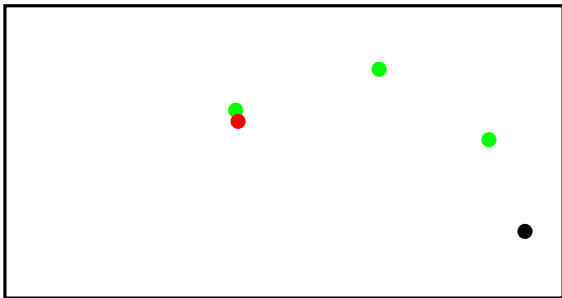
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## Example 2: starting with 2 blues, 3red



Program:

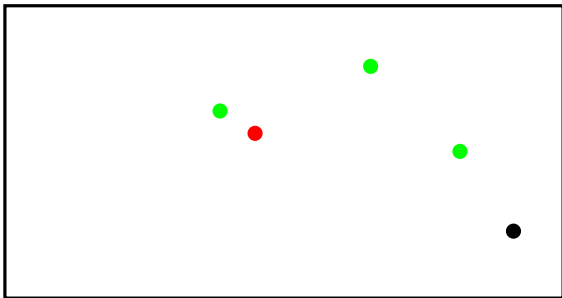
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## Example 2: starting with 2 blues, 3red



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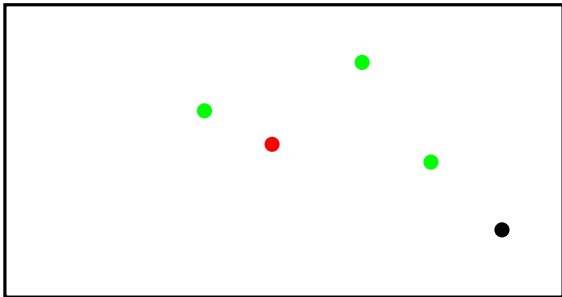
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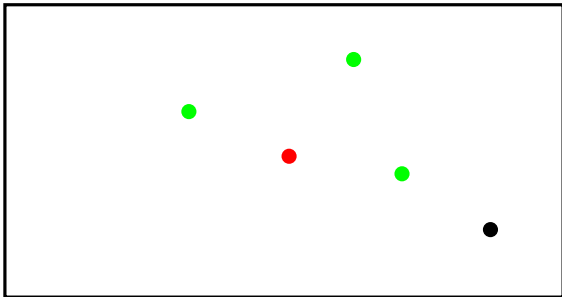
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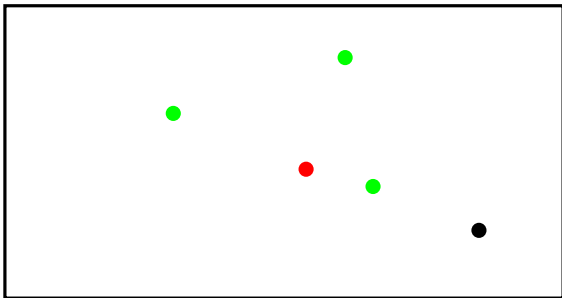
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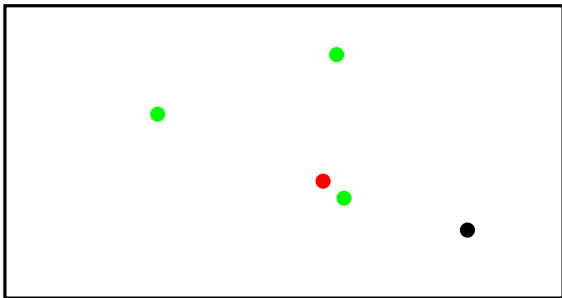
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## Example 2: starting with 2 blues, 3red



Program:

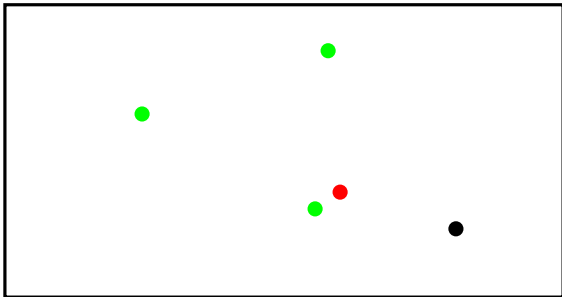
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Program:

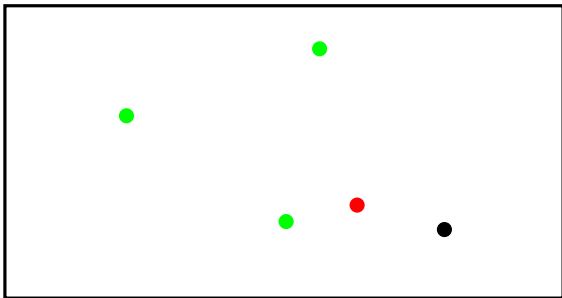
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## Example 2: starting with 2 blues, 3red



Program:

● ● → ● ●

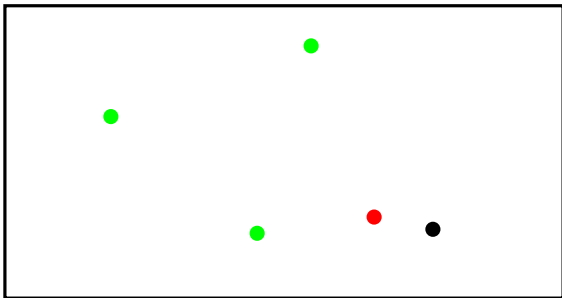
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Program:

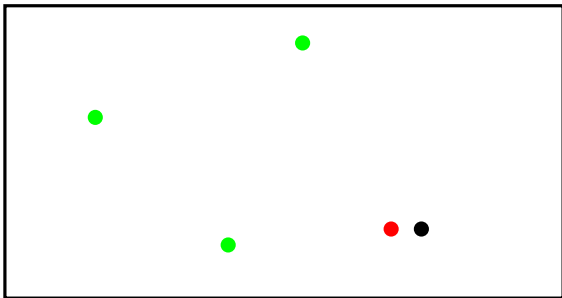
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Program:

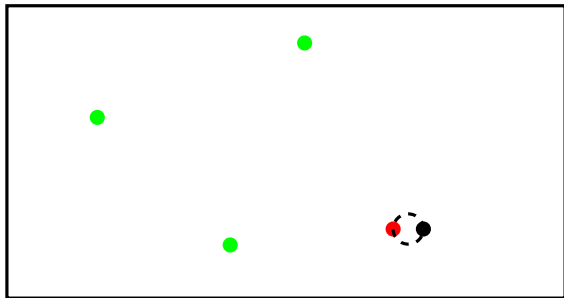
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Program:

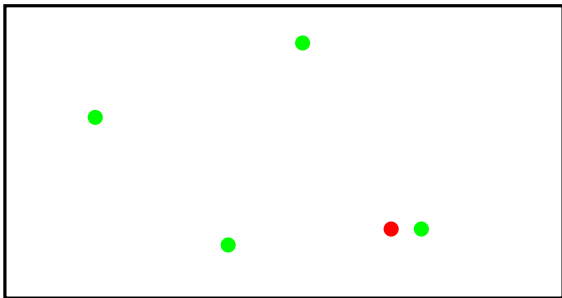
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## Example 2: starting with 2 blues, 3red



Program:

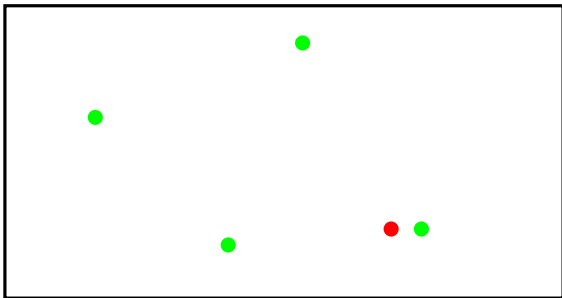
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## Example 2: Final result



Program:

● ● → ● ●

● ● → ● ●

● ● → ● ●

● ● → ● ●

# What is computed?

Let's interpret

- ● and ● by *yes*.
- ● and ● by *no*.
- Whatever the initial state is, ultimately, all agents will agree.
- They agree on *yes* iff the initial population of ● is strictly greater than the initial population of ●.

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$$n_{\bullet} > n_{\bullet},$$

that is to say

$$n_{\bullet} - n_{\bullet} > 0.$$

# Classical Population Protocols: Computable Predicates

Theorem (Angluin et al. 2006)

*A predicate is computable iff it is on the following list:*

- $\sum_{i=1}^k c_i n_i \geq a$ , where  $a, c_i$ 's are integer constants
- $\sum_{i=1}^k c_i n_i \equiv a \pmod{b}$  where  $a, b$  and  $c_i$ 's are constants
- Boolean combinations of the above predicates

## Alternate Characterization: Presburger Arithmetic

A predicate is computable iff it can be expressed in first-order logic using the symbols  $+$ ,  $0$ ,  $1$ ,  $\vee$ ,  $\wedge$ ,  $\neg$ ,  $\forall$ ,  $\exists$ ,  $=$ ,  $<$ ,  $(, )$  and variables.

(This system is known as Presburger Arithmetic [1929].)

Note: no multiplication.

### Examples:

majority:  $x_0 < x_1$

divisible by 3:  $\exists y : y + y + y = x_1$

at least 40%:  $x_0 + x_0 < x_1 + x_1 + x_1$

# Menu

Inspiration: Classical Population Protocols

**Large Population Protocols**

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# Population protocols with large populations

We want to consider

- a large population of agents (instead of finitely many agents)
- proportions of agents in a given state (instead of counts)
- protocols as computing functions (not only predicates)

# Sub-menu

## Large Population Protocols

My favorite example

The model

Convergence to an ordinary differential equation

Asymptotic Development

Computing with large population protocols

Our main result

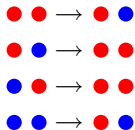
## A scenario

- Consider a population of individuals provided with mobile phones, moving in a somewhat restricted environment.
- Whenever two individuals meet, i.e., whenever they get within the transmission range of each-other, their respective mobile devices get connected, and potentially exchange data of common interest.
- In order to limit the amount of energy spent in such a process, one may want to limit the frequency of exchanges between nodes:
  - ▶ one could let two connected nodes exchange information only if they are both in some specific state, called *active*
  - ▶ say we want the frequency (or probability) of exchanges to be  $p = \frac{1}{2}$

# An example

States:  $\{\bullet, \bullet\}$

Rules of interactions:



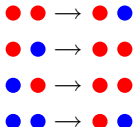
What can we say about

$$p_{\bullet} = \frac{\text{number of } \bullet}{\text{number of } \bullet + \text{number of } \bullet}?$$



## Exercise 0: when the number $n$ of agents is fixed.

- The interaction rules describe an homogeneous Markov chain with  $2^n$  states:
  - ▶ Special configuration:  $(\bullet, \bullet, \dots, \bullet)$  is left in one step.
  - ▶ Any other configuration is reachable with positive probability from any other configuration.

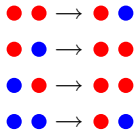


## Exercise 0: When the number $n$ of agents is fixed: continued

- By ergodic theorem, whatever the initial distribution is, the distribution of  $\bullet$ , and  $\bullet$  will converge
- to the unique stationary distribution of the Markov chain,
- an hence,

$E[p_{\bullet}]$  will converge to some (computable) rational value.

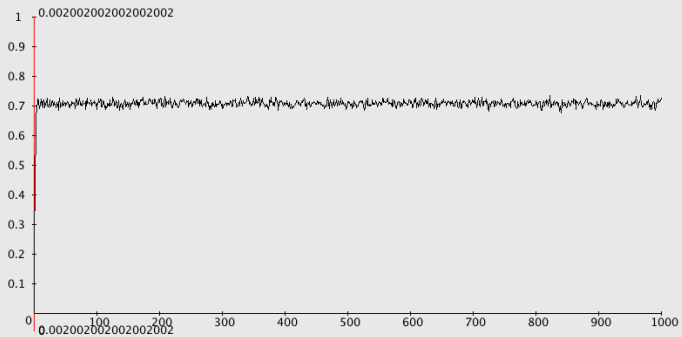
## When the number $n$ of agents is large?



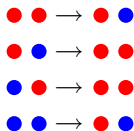
- What is the limit of  $p_{\bullet}$  when  $n$  goes to infinity?

données **graphe** histogramme

- moyenne
- +  $\frac{V}{V}$
- $\frac{V}{V}$



## An informal approach



- The mean number of ● created,

$$\begin{aligned} b(p_{\bullet}) &= -1 * p_{\bullet}^2 + 1 * p_{\bullet}(1 - p_{\bullet}) + 1 * p_{\bullet}(1 - p_{\bullet}) + 1 * (1 - p_{\bullet})^2 \\ &= 1 - 2p_{\bullet}^2 \end{aligned}$$

- must be equal, at the limit to 0,
- and hence

$$p_{\bullet} = \frac{\sqrt{2}}{2},$$

at the limit.

# Computing with large populations

- In other words,

this protocol **computes** real number  $\frac{\sqrt{2}}{2}$ .

- Which real numbers can be computed in the above sense?

## A scenario

- Consider a population of individuals provided with mobile phones, moving in a somewhat restricted environment.
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## Large Population Protocols

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Our main result



## General Case: Algorithm

An algorithm consists of

- a finite set of states  $Q = \{q_1, q_2, \dots, q_k\}$ .
- transition rules, mapping pairs of states to pairs of states

Executions are given by:

- instantaneous configuration:  $(x_1, x_2, \dots, x_k) \in [0, 1]^k$ , with  $\sum_i x_i = 1$ .
- transitions between configuration: two agents are picked, and updated according to the rules of the algorithm.
- some states are marked.
- we want to consider the proportion of agents in marked states.

Remark: Algorithm are assumed independent of size of population!

## Rescaling...

- Let  $Y_i^{(n)}(t)$  be the random variables equal to the numbers of agents in state  $q_i$  at time  $t$  in a population of size  $n$ .
- Let

$$\bar{Y}_i^{(n)}(t) = \frac{1}{n} \cdot Y_i^{(n)}(t).$$

$$\bar{Y}^{(n)}(t) = (\bar{Y}_1^{(n)}(t), \dots, \bar{Y}_{|Q|}^{(n)}(t)).$$

$$X^{(n)}(t) = \bar{Y}^{(n)}(\lfloor nt \rfloor) + (nt - \lfloor nt \rfloor) \cdot \left( \bar{Y}^{(n)}(\lfloor nt + 1 \rfloor) - \bar{Y}^{(n)}(\lfloor nt \rfloor) \right).$$

- By definition,
  - ▶  $X^{(n)}(t)$  is a continuous-time Markov chain obtained by linear interpolation of  $\bar{Y}^{(n)}$  with a time-acceleration of factor  $n$ .
  - ▶ After rescaling, the number of interactions occurring in one time unit is proportional to the number of agents in the population.

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# Convergence to an ordinary differential equation

## Proposition

For any initial conditions  $Y^{(n)}(0)$  such that  $Y^{(n)}(0) \rightarrow x$  when  $n \rightarrow \infty$ , the sequence of random processes  $X^{(n)}$  converges in law to the solution of the stochastic differential equation (with degenerated brownian motion):

$$dX(t) = b(X(t))dt \quad \text{with } X(0) = x. \quad (1)$$

where

■  $b : \mathbb{R}^{|\mathcal{Q}|} \rightarrow \mathbb{R}^{|\mathcal{Q}|}$  is the “balance” equation

► Formally:

$$b(x) = \sum_{(q_1, q_2) \in \mathcal{Q}^2} \left( x_{q_1} x_{q_2} \left( -e_{q_1} - e_{q_2} + \sum_{(q_3, q_4) \in \mathcal{Q}^2} \delta_{q_1, q_2, q_3, q_4} (e_{q_3} + e_{q_4}) \right) \right) \quad (2)$$

where  $\delta_{q_1, q_2, q_3, q_4} = 1$  if  $q_1, q_2 \rightarrow q_3, q_4$ , and 0 otherwise.

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## Large Population Protocols

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# Asymptotic Development

## Theorem

Assume that the ordinary differential equation  $dX(t)/dt = b(X(t))$  has a (exponentially) stable equilibrium  $b(x^*) = 0$ .

Then there exists a neighborhood of  $x^*$  such that, whenever  $\bar{Y}^{(n)}(0)$  belongs to this neighborhood, we have

$$\bar{Y}^{(n)}(t) \approx x^* + \frac{1}{\sqrt{n}} \mathcal{N}(0, \chi)$$

when  $t \rightarrow \infty$ ,

where  $\mathcal{N}(0, \chi)$  is the centered gaussian distribution with covariance matrix  $\chi$ , for some  $\chi$ .

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## Large Population Protocols

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Our main result

# Computation

A real number  $\nu$  is said to be computable if

- there exists a LPP  $\mathcal{P}$ , admitting finitely many equilibria,
- some of these finitely many equilibria  $x^* = (x_1, x_2, \dots, x_k) \in [0, 1]^k$  is stable
- and  $\sum_{q_i \in Q^+} x_i = \nu$  where  $Q^+$  is the set of marked states for  $\mathcal{P}$ .



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**Our main result**

# Main result

## Theorem

*$\nu$  is computable by an LPP*

*if and only if*

*$\nu \in [0, 1]$  is algebraic.*

# Sketch of proof

- Direct sense: ●
  - ▶ A computable number  $\nu$  must correspond to a  $x^*$  with  $b(x^*) = 0$ .
  - ▶  $b$  componentwise polynomial implies  $\nu$  algebraic.
- Undirect sense:
  - ▶ All rational numbers are computable. ●
  - ▶ Derandomization: probabilistic large population protocols can be simulated by large population protocols. ●
  - ▶ Constructing equilibria. ●
  - ▶ Enforcing stability. ●

# Menu

Inspiration: Classical Population Protocols

Large Population Protocols

Discussion and Conclusion

# Conclusion

- We proposed a formalization of population protocols with large populations.
- We proved convergence in the general case.
- We gave an asymptotic development of the convergence in some cases.
- We characterize all computable real numbers to be precisely algebraic numbers of  $[0, 1]$ .

# Current and future work

- Variants on the model.
- Going further:
  - ▶ We characterize computable numbers.
  - ▶ Can we characterize computable predicates?

## Sub-menu

Sketch of proof

# Direct sense

## Lemma

*For every  $\nu \in [0, 1]$ , if  $\nu$  is computable by a LPP then  $\nu$  is algebraic.*

- a computable number must correspond to an equilibrium  $x^*$  of  $b$ : i.e.  $b(x^*) = 0$ .
- $b$  is componentwise polynomial
- any solution of a system of polynomial equations which has finitely many solutions is component-wise algebraic.



# Undirect sense: step 1

## Computing all rationals

### Lemma

Let  $\nu \in [0, 1]$  be a rational number. There exists a LPP computing  $\nu$ .

- To compute  $1/k$ , consider the protocol  $\mathcal{M}$  over states  $Q_k = \{1, \dots, k\}$  given by the following transitions rules:

$$i j \rightarrow (i + 1) (j + 1)$$

- To compute  $p/q \in \mathbb{Q}$ , set marked states in an appropriate way.

## Undirect sense: step 2

### Derandomization

We focus on probabilistic LPPs, where the transition rules are defined by

$$q_i q_j \rightarrow \alpha_{i,j,k,l} q_k q_l$$

where all  $\alpha_{i,j,k,l}$  are rational numbers.

#### Lemma

*Let  $\nu \in [0, 1]$ , and assume that there exists a probabilistic LPP computing  $\nu$ , with rational probabilities. Then there exists a (deterministic) LPP computing  $\nu$ .*

## Undirect sense: step 3

### Constructing Equilibria

#### Lemma

*For any algebraic number  $\nu \in [0, 1]$ , there exists  $\delta \in \mathbb{N}$ ,  $\lambda \in \mathbb{Q}$ , and a protocol  $\mathcal{P}$  such that  $(\nu, \lambda\nu^2, \lambda^2\nu^3, \dots, \lambda^{\delta-2}\nu^{\delta-1}, 1 - \sum_{i=1}^{\delta-1} \lambda^{i-1}\nu^i)$  is an equilibrium of  $\mathcal{P}$ .*

## Undirect sense: step 3

### Constructing Equilibria

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- Let  $\nu \in (0, 1]$  be an algebraic number, and let  $P(X) = \sum_{i=0}^{\delta} a_i X^i$ , be a polynomial such that  $P(\nu) = 0$ , and  $P(0) > 0$ .
- Build  $\mathcal{P}_\epsilon$  with

$$dx_1 = \epsilon \left( a_0 + a_1 x_1 + \sum_{i=2}^{\delta-1} \frac{a_{i+1}}{\lambda^{i-1}} x_{i-1} x_1 \right)$$

$$dx_i = \lambda x_1 x_{i-1} - x_i \quad \text{for every } i = 2, \dots, \delta - 1$$

$$dx_\delta = - \sum_{i=1}^{\delta-1} dx_i.$$

where  $\lambda > 0$ , and  $\sum_{i=1}^{\delta-1} \lambda^{i-1} \nu^i \leq 1$ .

## Undirect sense: step 4

### Enforcing stability

#### Lemma

*Every algebraic number  $\nu \in [0, 1]$  is computable by an LPP.*

◀ back

## Undirect sense: step 4

### Enforcing stability

#### Lemma

*Every algebraic number  $\nu \in [0, 1]$  is computable by an LPP.*

- Establish stability using Routh-Hurwitz criterion. . .
- by choosing  $\epsilon$  sufficiently small.

◀ back