

# Lower Bounds on the State Complexity of Population Protocols

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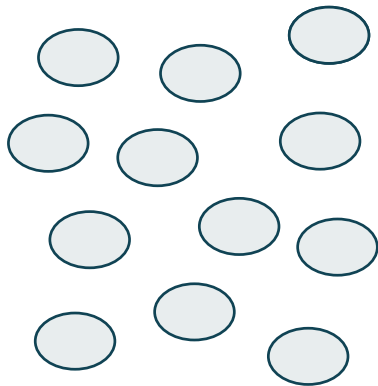
# Introduction

# The Setting

- ▶ population protocols

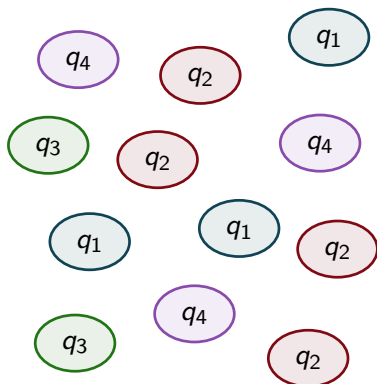
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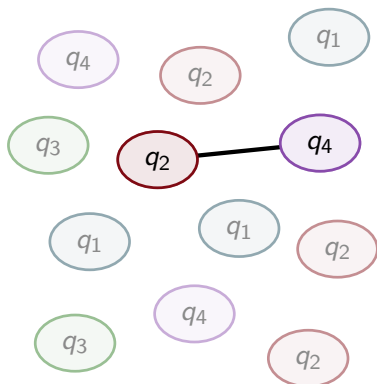
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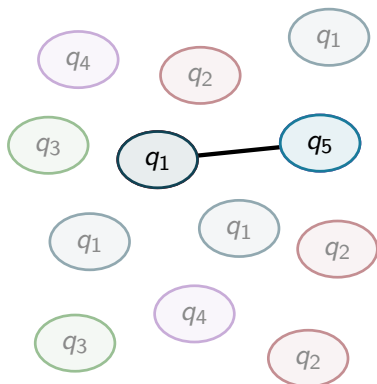
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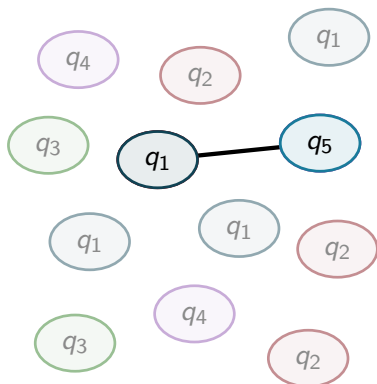
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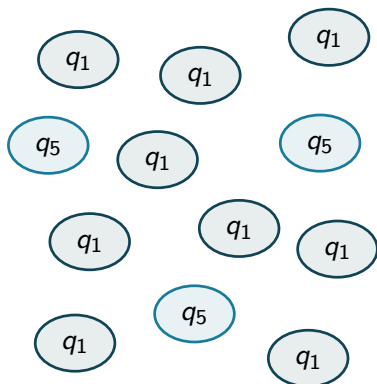
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- ▶ agents are finite-state machines
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- ▶ want to decide if initial configuration satisfies a property
  - ▶ computation by *stable consensus*



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- ▶ compute exactly semi-linear (or Presburger) predicates
- ▶ can compute **threshold**:  $x \geq k$ , for any  $k \in \mathbb{N}$

The question:



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How many states do we need for  $x \geq k$ ,  
if  $k$  grows large?

# State Complexity of Population Protocols

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  - ▶ **no lower bounds!**

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- ▶ This considers growth of  $Q$  w.r.t.  $n$ , whereas we consider growth of  $Q$  w.r.t. the size of the predicate
- ▶ For us,  $Q$  remains fixed independent of  $n$

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“Largest  $k$  for given number of states?”
- ▶ **Busy beaver function for population protocols!**

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Terms in this talk are only correct up to the number of exponents.

# A bound for leaderless protocols

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3. Showing that long sequences of runs admit linear combinations with certain properties
  - ▶ Purely mathematical result, based on linear algebra

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The protocol rejects **iff** it reaches a stable 0-consensus.

# Extending Stable Consensuses

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**Our goal:** modify a rejecting run and “smuggle” additional agents from the initial state  $q_0$  to a  $q$  with  $C(q) > 2^{2^{|Q|}}$

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- ▶ **Too hard!**

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Only  $2^{|Q|}$  colours

$\Rightarrow$  Every  $x \geq k$  protocol with  $k \geq 2^{2^{|Q|}}$  has a “borrowing extension”

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Remove borrowing by executing the solution on top of  $C_{\text{plenty}}$  !



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6. Repeat 5 to reject arbitrarily high inputs: Contradiction!

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- ▶ Still a gap for leaderless protocols, and large gap for protocols with a leader
- ▶ Protocols with a leader might be exponentially more succinct than without (or more!)
- ▶ Conjecture: both known lower bounds on  $k$  are tight

Thank you for  
your attention!