

# Advances in Anonymous Dynamic Networks

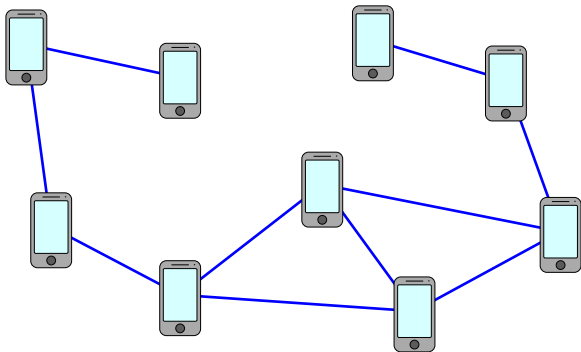
Giovanni Viglietta

Joint work with Giuseppe A. Di Luna

JAIST – June 29, 2022

# Dynamic networks

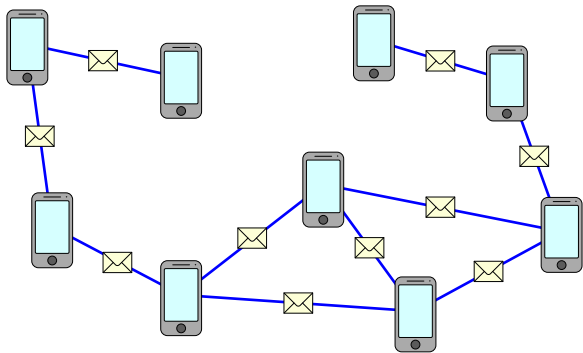
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What can be computed by this network, and in how many rounds?

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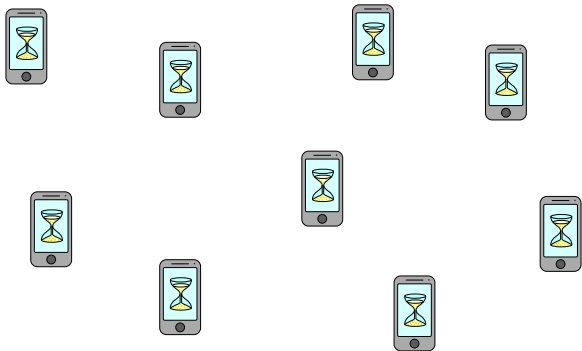
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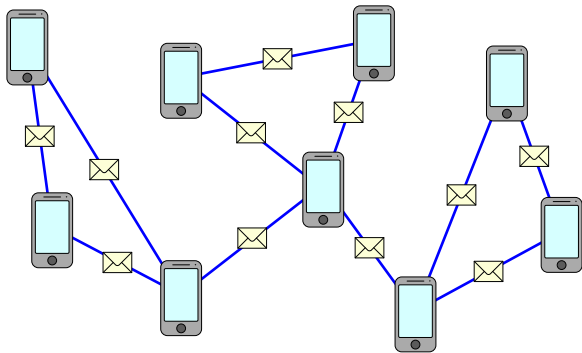
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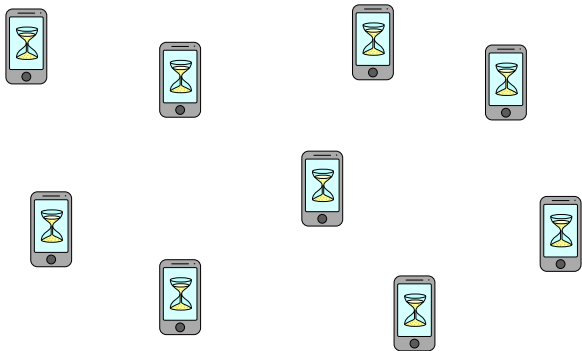
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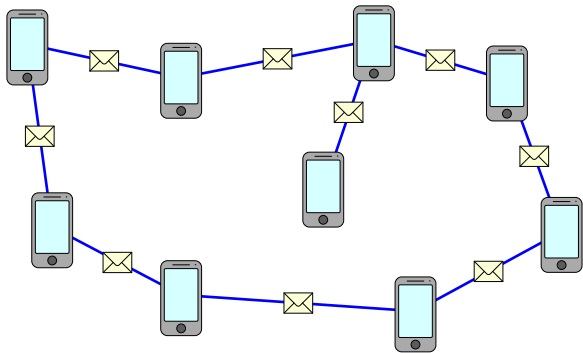
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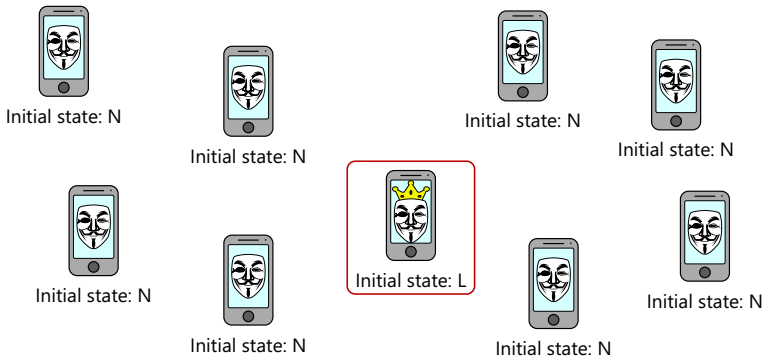
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What can be computed by this network, and in how many rounds?

# Counting anonymous agents with a Leader

A typical assumption is that the dynamic network is *anonymous*, i.e., all agents start with the same state, except one: the *Leader*.

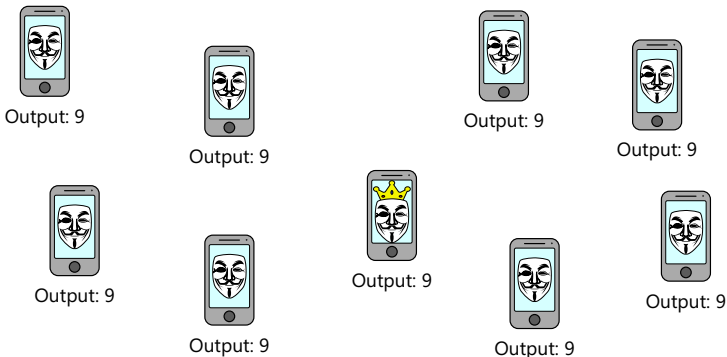


The *complete problem* in this model is the **Counting Problem**: Eventually, all agents must know the total number of agents,  $n$ . (If agents have inputs, also compute how many agents have each input.)



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# No Leader or multiple Leaders

It is also interesting to explore the scenario where *no Leader* or *multiple Leaders* are present.



Initial state: N



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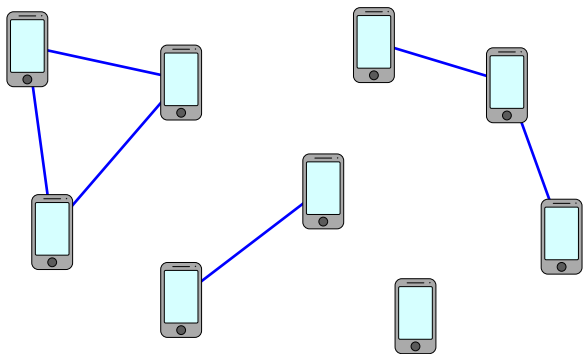
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## Disconnected networks

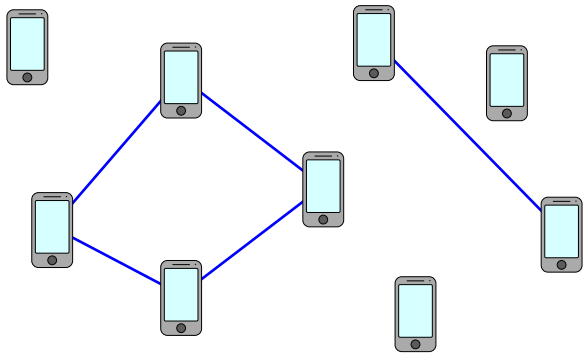
Also, while the network is typically assumed to be connected at every round, we may relax this assumption.



In a  $T$ -time-connected network, the union of the network graphs at  $T$  consecutive rounds is a connected multi-graph.

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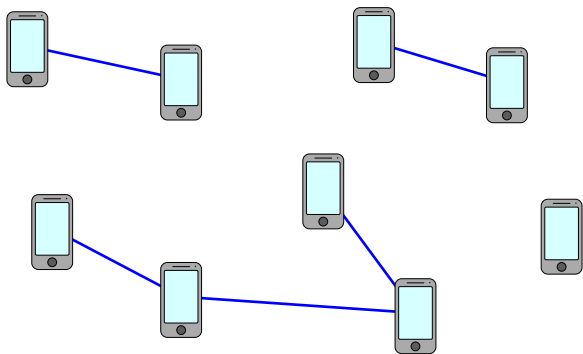
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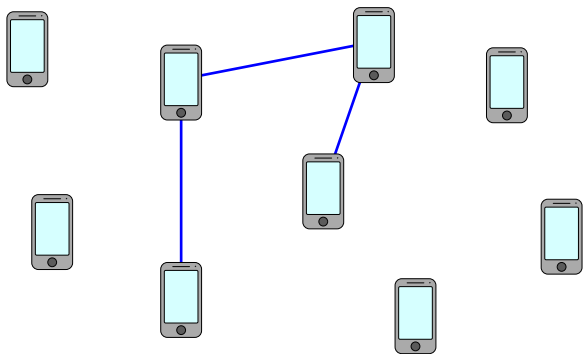
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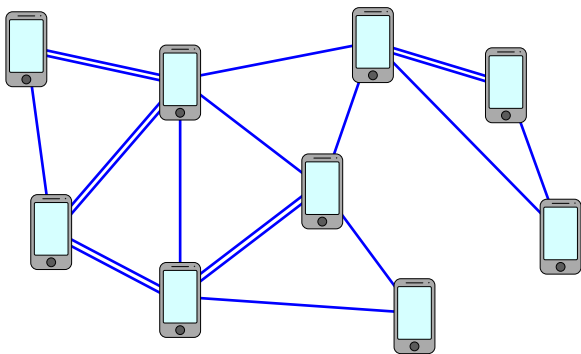
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# Previous work on the Counting Problem

- **Michail et al.:** Looks impossible! (SSS 2013)
- **Di Luna et al.:** Solvable in  $O(e^{N^2} N^3)$  rounds (ICDCN 2014)
- **Di Luna–Baldoni:**  $O(n^{n+4})$  rounds (OPODIS 2015)
- **Kowalski–Mosteiro:**  $O(n^5 \log^2 n)$  rounds (ICALP 2018 Best Paper)
- **Kowalski–Mosteiro:**  $O(n^{4+\epsilon} (\log^3 n) / \ell)$  rounds (ICALP 2019)
- **Kowalski–Mosteiro:**  $\tilde{O}(n^{2T(1+\epsilon)+3} / \ell)$  rounds (arXiv 2022)
- **Di Luna–Viglietta:**  $3n$  rounds (FOCS 2022)
- **Di Luna–Viglietta:**  $(\ell^2 + \ell + 1)Tn$  rounds (Today's talk)

Symbols:

- $n$ : number of agents in the network (unknown)
- $\ell$ : number of Leaders (known; default:  $\ell = 1$ )
- $T$ : connectivity parameter of the network (known; default:  $T = 1$ )
- $N$ : upper bound on  $n$  (unknown, except in ICDCN 2014)

### Theorem

For  $\ell = 1$  and  $T = 1$ , we have:

- *Stabilizing algorithm in  $2n$  rounds.*
- *Terminating algorithm in  $3n$  rounds.*
- *Lower bound of  $2n$  rounds (for stabilization and termination).*

*Local memory, local computation time, and message size are polynomial in  $n$ . Also works if the network is a multi-graph.*

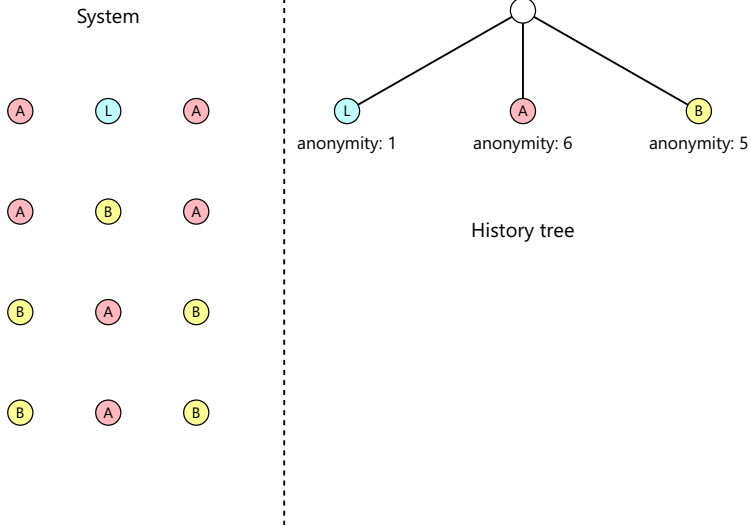
The theorem applies not only to the Counting Problem, but to *all* problems computable in anonymous (dynamic) networks.

These are precisely the *multi-aggregate* functions  $f$ :

- Agent  $p$  outputs  $f(x_p, \mu)$ ,
- where  $x_p$  is the input of agent  $p$ ,
- and  $\mu$  is the multi-set of all inputs.

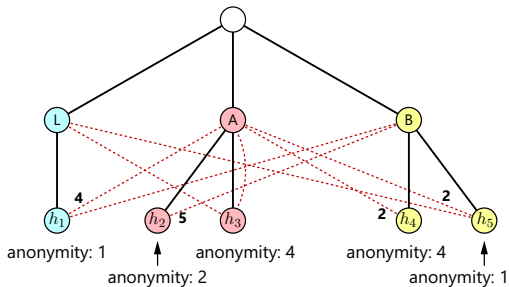
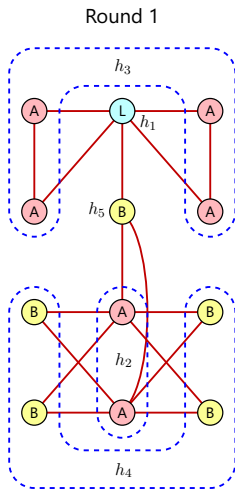
# History tree

We introduced the *history tree* as our main tool of investigation.



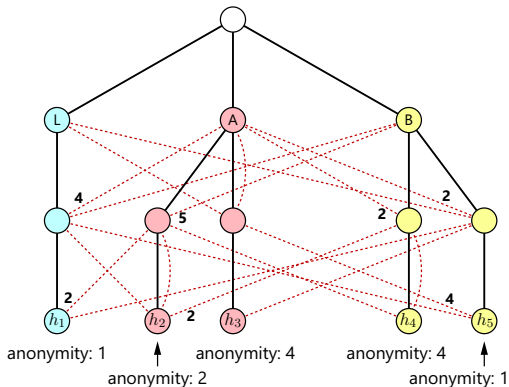
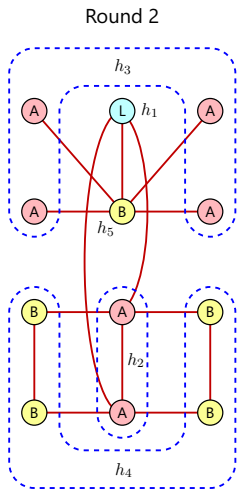
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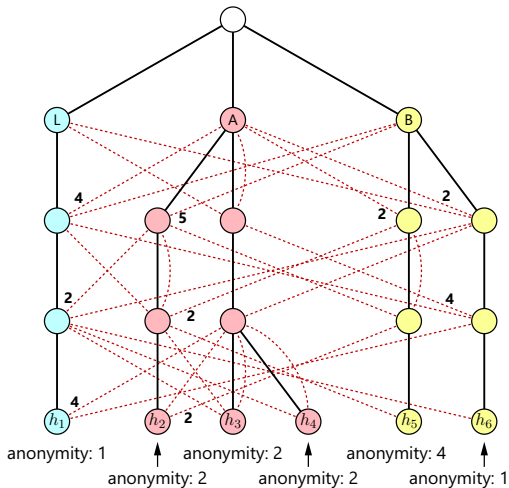
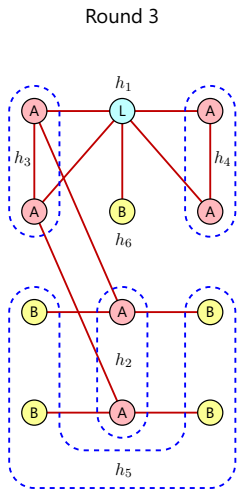
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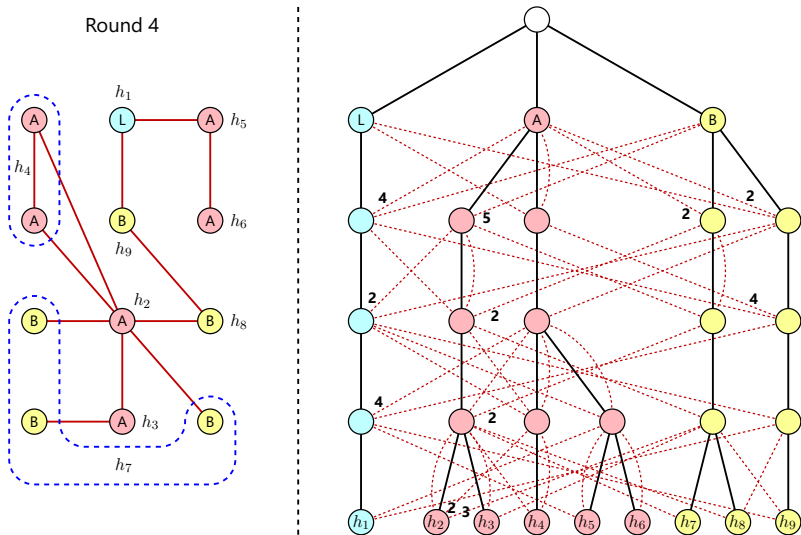
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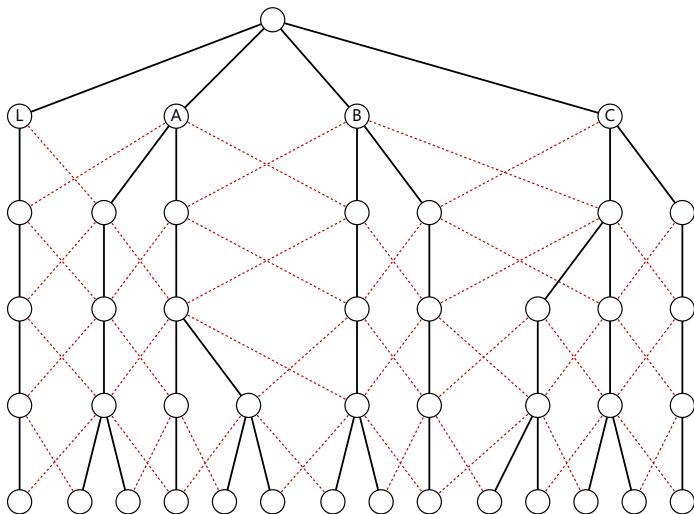
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# View of a history tree

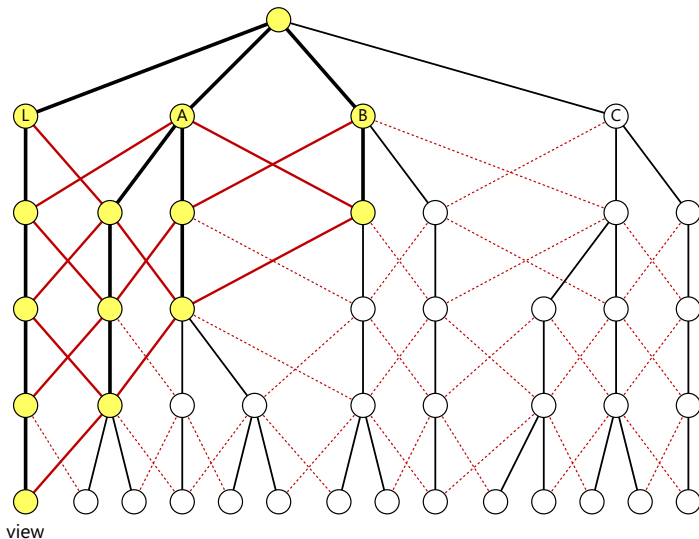
At any point in time, an agent only has a *view* of the history tree.





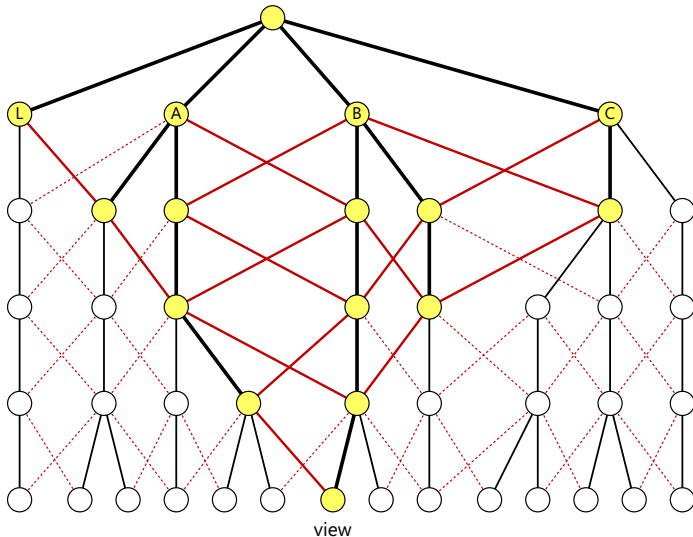
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# Views as internal states and messages

An agent's view summarizes its whole *history* up to some round.

## Observation

*Without loss of generality, we may assume that an agent's internal state coincides with its view of the history tree.*

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*Without loss of generality, we may assume that an agent broadcasts its own internal state at every round.*

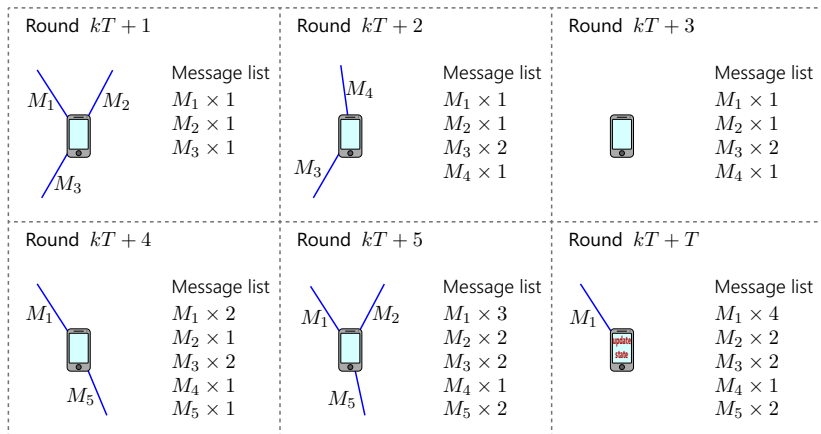
This is good because, at round  $i$ , the size of a view is only  $O(i^3)$ .

## Observation

*If a problem is solvable in a polynomial number of rounds, it can be solved by using a polynomial amount of local memory and sending messages of polynomial size.*

# $T$ -time-connected networks

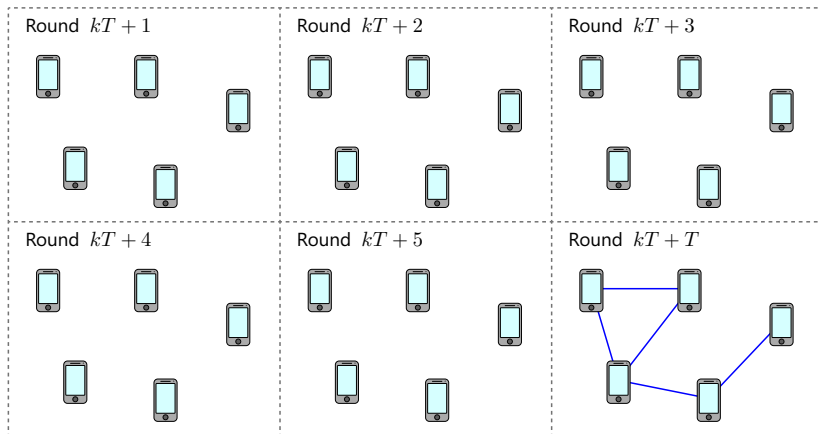
Any algorithm for  $T = 1$  can be adapted to networks with  $T > 1$ , assuming  $T$  is known by all agents.



Each agent accumulates messages for  $T$  rounds, and then updates its state all at once. Hence, the running time is multiplied by  $T$ .

# $T$ -time-connected networks

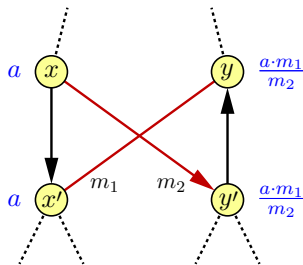
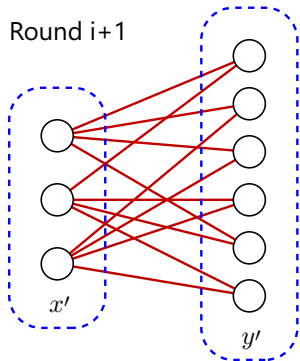
This is the best we can do: Consider, for instance, a network that contains no links for  $T - 1$  out of every  $T$  rounds.



Thus, the Counting Problem has a lower bound of  $2Tn$  rounds.

# Leaderless computation

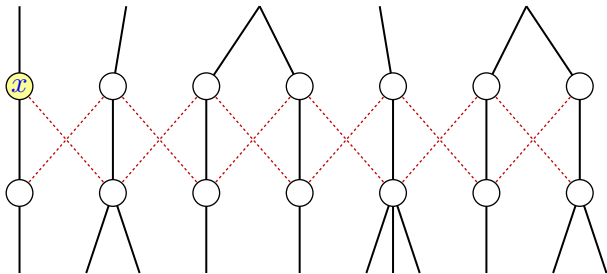
We will re-use a technique from our previous stabilizing algorithm. Suppose we know the anonymity of a node  $x$  with a single child  $x'$ .



If the agents represented by  $x$  have observed agents whose corresponding node  $y$  has only one child  $y'$ , then we can compute the anonymity of  $y$  and  $y'$ , as well.

# Leaderless computation

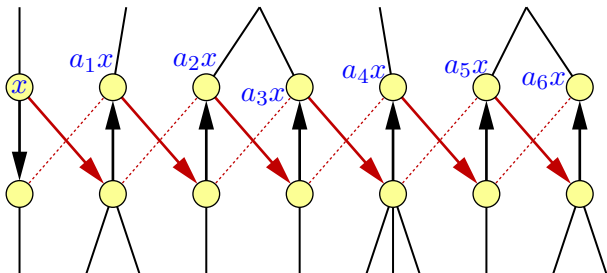
If all nodes in a level have only one child, we can compute the anonymity of each one of them as a function of a single node's anonymity  $x$ .



Since there are only  $n$  agents, the tree can branch at most  $n$  times. Thus, among the first  $n$  levels, there must be a level where no node branches. In this level, we can compute all anonymities up to a common factor  $x$ .

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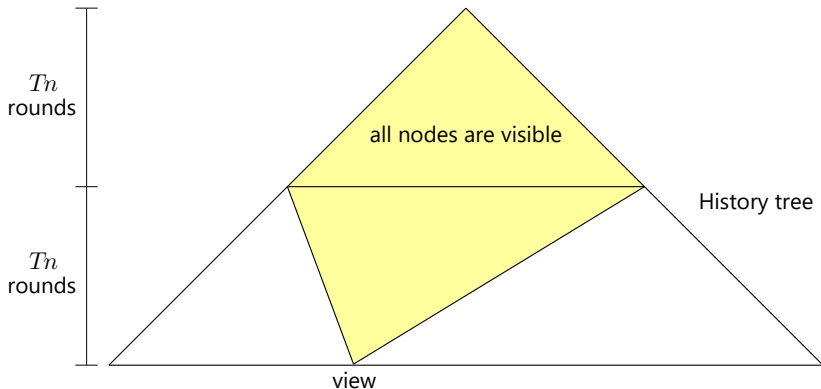


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# Leaderless computation

Note that, after  $2T_n$  rounds, all nodes in the first  $n$  levels of the history tree are in the views of all agents.



Thus, within  $2T_n$  rounds, all nodes can count all agents with any given input up to a common factor  $x$ .

## Leaderless computation

Thus, if there is no Leader, we can solve in  $2Tn$  rounds all the multi-aggregate functions  $f$  such that:

$$f(x_i, \{x_1 \times n_1, x_2 \times n_2, \dots, x_m \times n_m\}) = f(x_i, \{x_1 \times kn_1, x_2 \times kn_2, \dots, x_m \times kn_m\}).$$

We call them *ratio-multi-aggregate* functions.

Examples include the mean (cf. *Average Consensus Problem*), variance, median, maximum, mode, and other statistical functions.

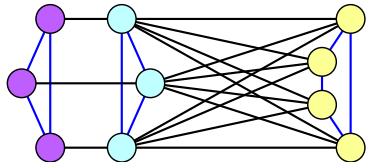
More specifically, we can compute all ratio-multi-aggregate functions:

- in  $2Tn$  rounds without explicit termination;
- in  $T(n + N)$  with termination, if an upper bound  $N \geq n$  is known by all agents (waiting  $TN$  rounds yields a certificate).

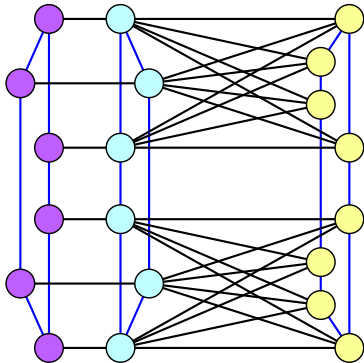
# Leaderless computation

The following example shows that no other function can be computed without a Leader: We can multiply all anonymity by any integer factor  $\geq 2$  and get the same history tree.

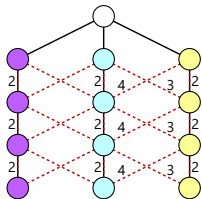
System 1



System 2

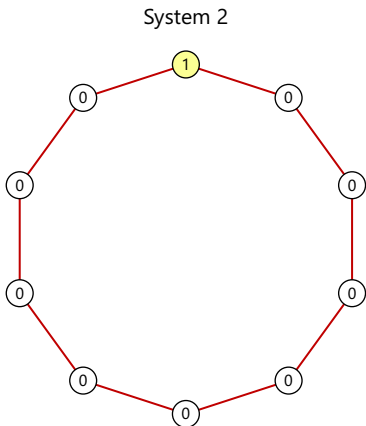
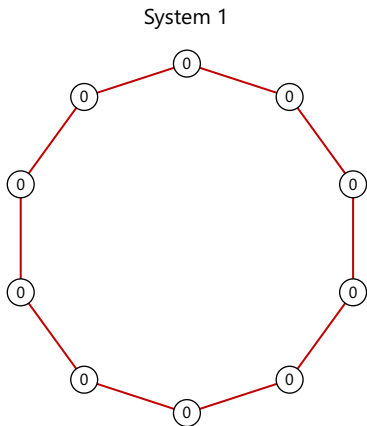


History tree



# Leaderless computation

Note that termination is impossible if nothing is known about  $n$ .



If an algorithm takes  $m$  rounds to terminate on a ring with all 0's (note that  $m$  does not depend on  $n$ ), then it terminates incorrectly on a ring of size  $2m + 2$  with all 0's and a single 1.

# Leaderless computation

Also,  $2Tn$  is a lower bound on the Average Consensus Problem.



Input: 0



Input: 0



Input: 0



Input: 0



Input: 0



Input: 0



Input: 1



Input: 0

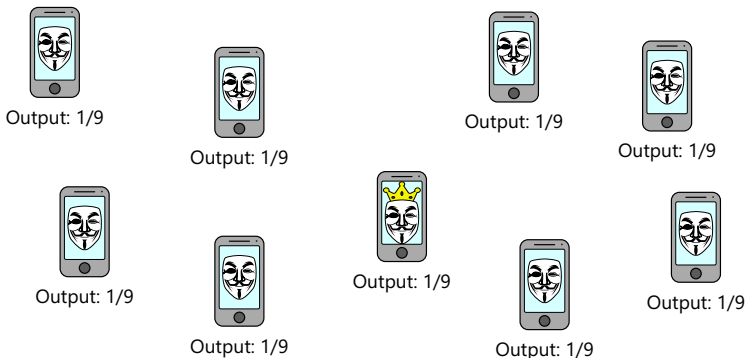


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Indeed, if we assign input 1 to one agent and 0 to all other agents, the Average Consensus Problem becomes equivalent to the Counting Problem with a single Leader.

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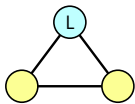


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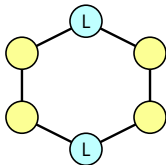
# Multiple Leaders

The Counting Problem is unsolvable with no knowledge on the number of Leaders,  $\ell$ .

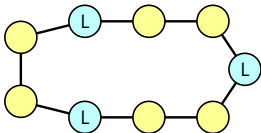
System 1



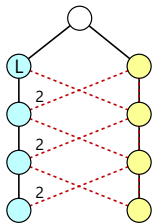
System 2



System 3



History tree

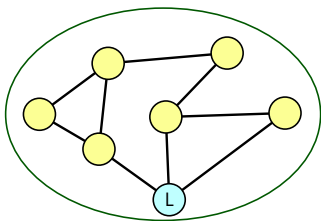


In the above (static) networks, the history tree is the same.

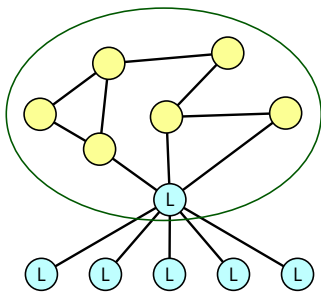
# Multiple Leaders

Having more than one Leader may not be very helpful. Actually, multiple Leaders introduce more symmetry in the network.

System 1



System 2



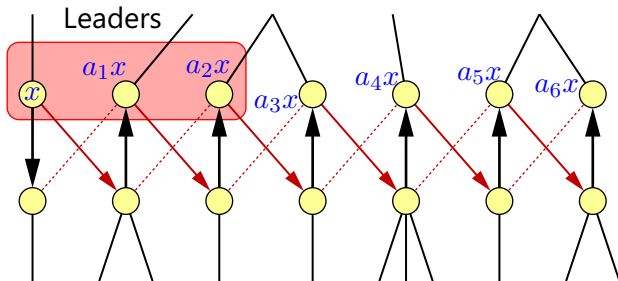
If multiple Leaders were always helpful, a single Leader could “pretend” to see several other Leaders to speed up computation.



# Multiple Leaders

For a stabilizing (non-terminating) Counting algorithm, we can use the same technique as before (assuming that all agents know  $\ell$ ).

As soon as no node branches for a round, we can compute all anonymities as a function of a single Leader node's anonymity,  $x$ .

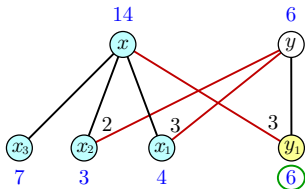
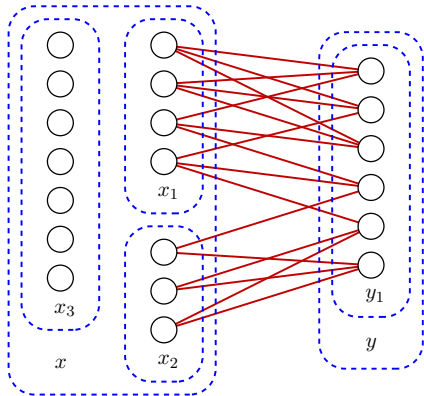


We know that  $x + a_1x + a_2x = \ell$ , and we can determine  $x$ .

This yields a non-terminating Counting algorithm that stabilizes in at most  $2Tn$  rounds (optimal).

# Single-Leader algorithm summary

Suppose we know the anonymities of a node  $x$  and its children. If some of the agents represented by  $x$  have observed agents represented by  $y$ , we can *guess* the anonymity of a child of  $y$ .

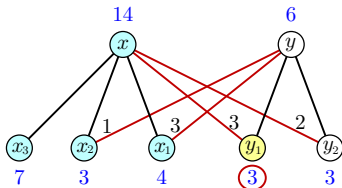
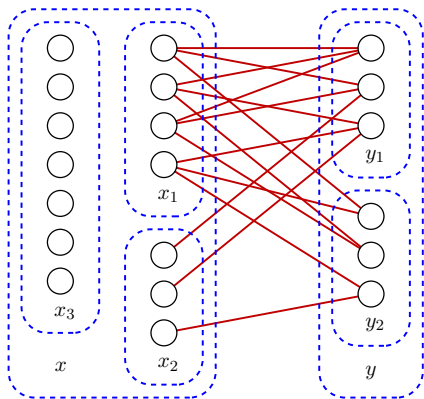


$$\text{Guess on } y_1: \frac{4 \cdot 3 + 3 \cdot 2}{3} = 6$$

If only one child of  $y$  has seen  $x$ , then the guess is *correct*.

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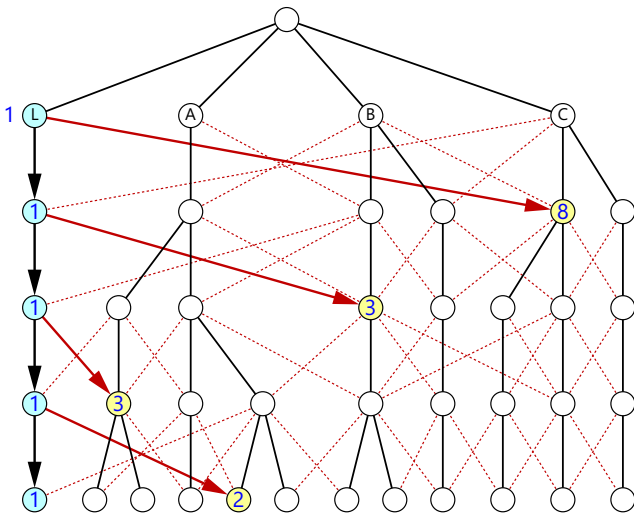


$$\text{Guess on } y_1: \frac{4 \cdot 3 + 3 \cdot 1}{3} = 5$$

Otherwise, the guess is an *overestimation* of the anonymity.

# Single-Leader algorithm summary

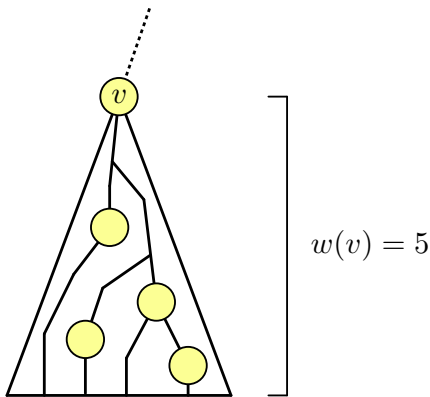
We can make one guess per round using the Leader's observations.



How do we know which guesses are correct?

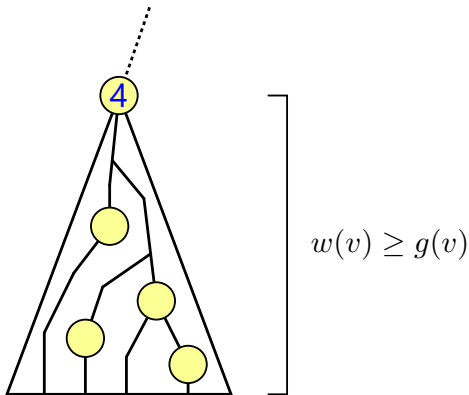
# Single-Leader algorithm summary

When a node  $v$  has a guess, we define its *weight*  $w(v)$  as the number of nodes in the subtree hanging from  $v$  that have guesses.



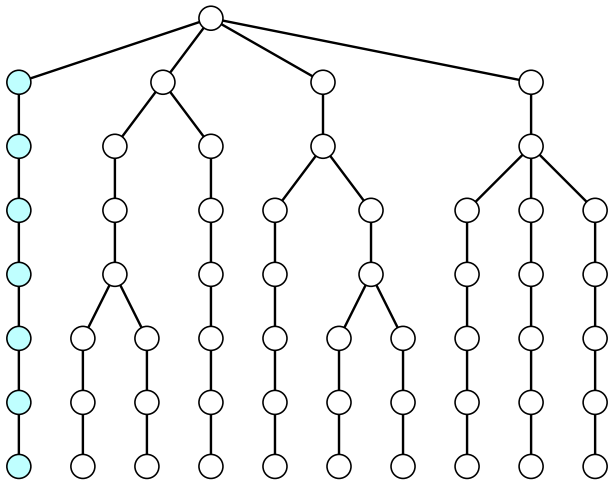
# Single-Leader algorithm summary

A node  $v$  is *heavy* if its weight  $w(v)$  is at least as large as the value of its guess  $g(v)$ .



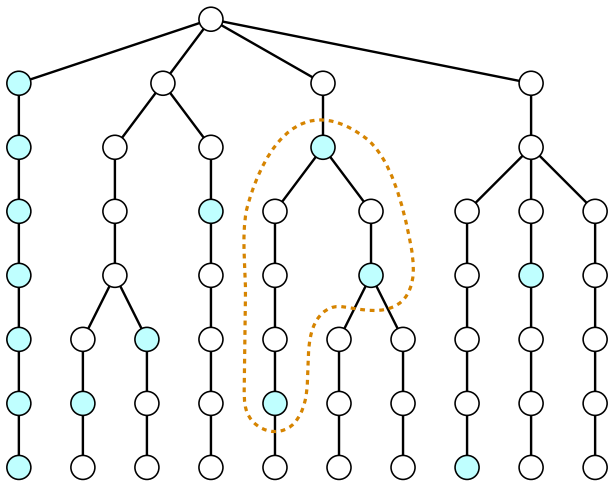
**Correctness Criterion:** If a node  $v$  is heavy and no descendants of  $v$  are heavy, then the guess on  $v$  is correct.

## Single-Leader algorithm summary



Initially, all Leader nodes are Guessers with anonymity  $\ell = 1$ .  
Eventually, some guessed nodes become correct.

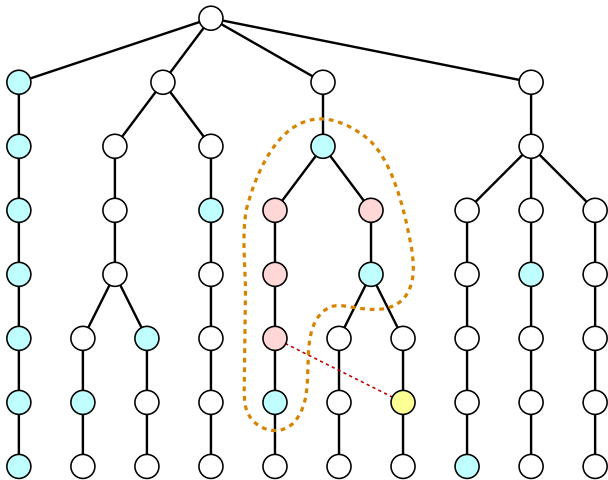
## Single-Leader algorithm summary



Correct nodes will form *isles*, which allow us to determine more anonymities.

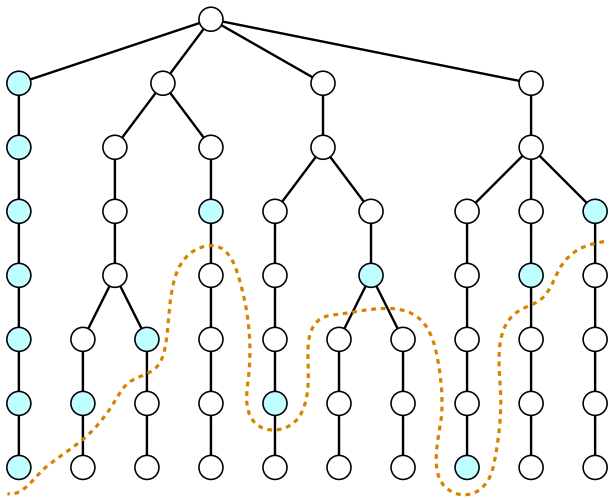


# Single-Leader algorithm summary



In turn, all nodes whose anonymity is known and whose children's anonymities are known become new Guessers.

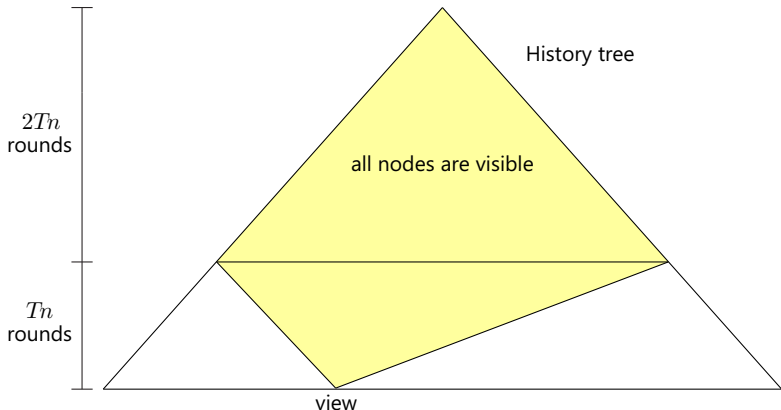
# Single-Leader algorithm summary



Eventually, some nodes determine a *cut* of the history tree, in which case we have an estimate  $n'$  on  $n$ , given by their sum.

## Single-Leader algorithm summary

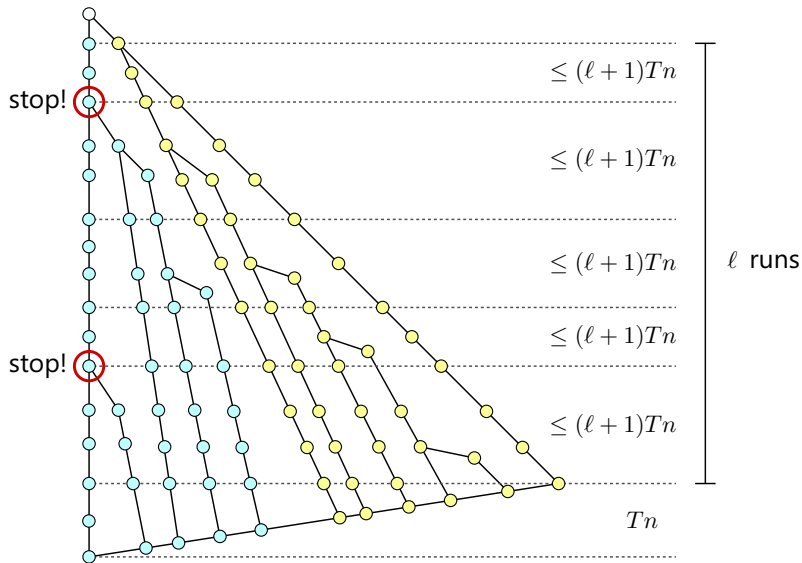
Once we have a cut and an estimate  $n' \leq n$ , we wait  $Tn'$  rounds.  
If  $n' < n$ , a new node appears in the first levels of the history tree.



If  $n' = n$ , then no new nodes appear, and the algorithm terminates.  
This happens within  $3Tn$  rounds.

# Multiple Leaders

With  $\ell > 1$  of Leaders, we do  $\ell$  runs similar to the previous one.



# Multiple Leaders

Terminating algorithm for  $\ell > 1$  Leaders:

- Do  $\ell$  runs of the terminating algorithm for  $\ell = 1$  as follows.
  - Choose a branch of Leader nodes and assign it anonymity  $x$ .
  - Run the terminating algorithm assuming  $x = \ell$  (note that all guesses are still upper bounds of the real anonymities).
  - If we encounter a node where the chosen Leader branch splits, stop the current run and proceed with the next.
  - Else, the algorithm eventually terminates with an estimate  $n'_i$  of  $n$ , as well as an estimate of all nodes' anonymities.
  - If the sum of Leaders' anonymities is  $\ell$ , store  $n'_i$  and proceed with the next run. Else, repeat this run with  $x = \ell - 1$ , etc.
- We end up with at most  $\ell$  estimates of  $n$ :  $n'_1, n'_2, \dots$ .  
Wait another  $T \cdot \max\{n'_1, n'_2, \dots\}$  rounds to confirm them.
- If the  $n'_i$ 's have not changed, they are all equal to  $n$  and all correct (note that at least one run must be correct, because the Leaders can split at most  $\ell - 1$  times).

# Conclusions

## Theorem

*Any problem that is solvable in a  $T$ -time-connected anonymous dynamic network with no Leader has a solution:*

- *in  $2Tn$  rounds without explicit termination,*
- *in  $T(n + N)$  rounds with termination if  $N \geq n$  is known.*

*$2Tn$  rounds is a lower bound for the Average Consensus Problem.*

## Theorem

*Any problem that is solvable in a  $T$ -time-connected anonymous dynamic network with a known number  $\ell \geq 1$  of Leaders has a solution:*

- *in  $2Tn$  rounds without explicit termination,*
- *in  $(\ell^2 + \ell + 1)Tn$  rounds with termination.*

*$2Tn$  rounds is a lower bound for the Counting Problem.*

**Open Problem:** What if message size is limited to  $O(\log n)$ ?