## Consensus with Three Options

"Stabilizing Consensus with Many Opinions" - Becchetti et al.
"Fast Plurality Consensus in Regular Expanders" - Cooper et al.

Laurent Chuat
February 27, 2018
Network Security Group, ETH Zurich

The Consensus Problem

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$$

The Consensus Problem


The Consensus Problem


$$
n=9
$$

## The Consensus Problem



$$
\begin{gathered}
n=9 \\
\Sigma=\{\text { "blue", "orange" }\}
\end{gathered}
$$

## The Consensus Problem



$$
\begin{gathered}
n=9 \\
\Sigma=\{\text { "blue", "orange" }\}
\end{gathered}
$$

## The Consensus Problem



$$
\begin{gathered}
n=9 \\
\Sigma=\{\text { "blue", "orange" }\}
\end{gathered}
$$

Variants of Consensus


## Variants of Consensus



Complete Network


Incomplete Network

## Variants of Consensus



## Variants of Consensus



## Consensus in the Age of Blockchains



Nakamoto Consensus

- Objective: consensus on the set and order of transactions
- How: proof of work
- Why: prevent censorship and multiple spending


## Byzantine Adversaries

## General 4

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General 3

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General 2

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General 5


General 1

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General 6 tht

General 7
$\square$

## Byzantine Adversaries



## Byzantine Adversaries



## Byzantine Adversaries



## Byzantine Adversaries



General 2


Attack!

General 6


Retreat!


General 7


Retreat!
[1] "The Byzantine Generals Problem", Leslie Lamport, Robert Shostak, and Marshal Pease, 1982.

## Objective

The goal of Byzantine agreement is to bring the system into a configuration that meets the following conditions:

1. Agreement
2. Validity
3. Termination

# Stabilizing Consensus with Many Opinions 

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August 28, 2015

$$
\begin{array}{ccc}
0^{\circ} & 0 \\
0^{\circ} & & 0 \\
0 & & 0^{\circ} \\
0 & & 0^{\circ}
\end{array}
$$

## Setting



## 3-Majority Dynamics



## 3-Majority Dynamics



## 3-Sampling: Tie Breaking



## 3-Sampling: Including the Node Itself



## 3-Sampling: With Repetitions



## Objective

1. Almost Agreement: The system must reach a regime of configurations where all but a negligible subset (i.e., having size $\mathcal{O}\left(n^{\gamma}\right)$ for a constant $\left.\gamma<1\right)$ of the nodes support the same opinion.

## Objective

2. Almost Validity: Converge w.h.p. to an almost agreement where all but a negligible subset keep the same valid opinion.

## Objective

3. Non Termination: Nodes are not necessarily able to detect any global property.

## Objective

4. Stability: Convergence is only guaranteed to hold with high probability (in short, w.h.p.) and over a long period (i.e., polynomial number of rounds).

## Notation

| $n$ | number of nodes |
| :--- | :--- |
| $\Sigma$ | set of opinions |
| $W \subseteq \Sigma$ | set of active opinions |
| $c:=\left(c_{1}, \ldots, c_{\|\Sigma\|}\right)$ | configuration |
| $c^{(t)}$ | configuration at time $t$ |
| $c_{i}$ | support of opinion $i$ |
| $X_{i, u}^{(t)}$ | node $u$ gets opinion $i$ at time $t$ |

## Drift of Below-Average Opinions

$$
\mathrm{P}\left(x_{i, u}^{(t+1)}=1 \mid \mathrm{C}^{(t)}=\mathrm{c}\right)=\left(\frac{\mathrm{c}_{i}}{n}\right)^{3}+\ldots
$$



## Drift of Below-Average Opinions

$$
\mathrm{P}\left(x_{i, u}^{(t+1)}=1 \mid \mathbf{C}^{(t)}=\mathrm{c}\right)=\ldots+3\left(\frac{c_{i}}{n}\right)^{2}\left(\frac{n-c_{i}}{n}\right)+\ldots
$$



## Drift of Below-Average Opinions

$$
\begin{aligned}
& \mathbf{P}\left(X_{i, u}^{(t+1)}=1 \mid \mathrm{C}^{(t)}=\mathrm{C}\right)=\ldots \\
& +\left(\frac{C_{i}}{n}\right)\left[1-\left(\frac{\sum_{l \in S}^{k} C_{l}^{2}}{n^{2}}+2\left(\frac{C_{i}}{n}\right)\left(\frac{n-c_{i}}{n}\right)\right)\right]
\end{aligned}
$$



## Drift of Below-Average Opinions

Lemma 2.1

$$
\mathrm{E}\left[C_{i}^{(t+1)} \mid \mathrm{C}^{(t)}=\mathrm{c}\right]=c_{i}\left(1+\frac{c_{i}}{n}-\frac{\sum_{j \in W} c_{j}^{2}}{n^{2}}\right) \leq c_{i}\left(1+\frac{c_{i}}{n}-\frac{1}{|W|}\right)
$$

## Drift of Below-Average Opinions

If $c_{i}=n /|W|$, then

$$
\mathrm{E}\left[C_{i}^{(t+1)} \mid \mathrm{C}^{(t)}=\mathrm{c}\right] \leq c_{i}
$$

## Symmetry-Breaking



## Symmetry-Breaking

Lemma 3.3. Let c be any configuration with $|W|$ active opinions. Within $t=\mathcal{O}\left(|W|^{2} \log ^{1 / 2} n\right)$ rounds, it holds that

$$
\mathrm{P}_{\mathrm{c}}\left(\exists i \text { such that } C_{i}^{(t)} \leq n /|W|-\sqrt{|W| n \log n}\right) \geq \frac{1}{2}
$$

## Dropping Stage 1

Lemma 3.4. Let c be any configuration with $|W| \leq n^{1 / 3-\epsilon}$ active opinions, where $\epsilon>0$ is an arbitrarily small positive constant, and such that an opinion $i$ exists with $c_{i} \leq n /|W|-\sqrt{|W| n \log n}$. Within $t=\mathcal{O}(|W| \log n)$ rounds, opinion $i$ becomes $\mathcal{O}\left(|W|^{2} \log n\right)$ with high probability.

## Dropping Stage 2

Lemma 3.5. Let c be any configuration with $|W| \leq n^{1 / 3-\epsilon}$ active opinions, where $\epsilon>0$ is an arbitrarily small positive constant, and such that an opinion $i$ exists with $c_{i} \leq n /(2|W|)$. Within $t=\mathcal{O}(|W| \log n)$ rounds, opinion $i$ disappears with probability at least $1 / 2$.

## The F-Static Adversary

At the end of the first round, once every node has fixed his own initial opinion, the adversary looks at the configuration and arbitrarily replaces the opinion of at most $F$ nodes with an arbitrary opinion.

$F=3$

## The F-Static Adversary

Corollary 4.1. Let $k \leq n^{\alpha}$ for some constant $\alpha<1$ and $F=n / k-\sqrt{k n \log n}$. Starting from any initial configuration having $k$ opinions, the 3 -majority protocol reaches a stabilizing almost-consensus in presence of any F-static adversary, w.h.p.

## The F-Dynamic Adversary

At the end of every round $t$, after nodes have updated their opinions, the adversary looks at the current configuration and replaces the opinion of up to $F$ nodes with any opinion.


## Final result

Theorem 4.2. Let $k \leq n^{\alpha}$ for some constant $\alpha<1$ and $F=\beta \sqrt{n} /\left(k^{5 / 2} \log n\right)$ for some constant $\beta>0$. Starting from any initial configuration having $k$ opinions, the 3-majority reaches a valid stabilizing almost-consensus in presence of any F-dynamic adversary within a bounded number of rounds, with high probability.

# Fast Plurality Consensus in Regular Expanders 

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## Regular Expanders

A graph is regular if every vertex has the same degree (i.e., the number of edges at that vertex).


On the left: complete graph, On the right: 4-regular graph

## Two-sample voting



## Random Walk as a Markov Chain



A random walk on the graph defines a Markov chain.

## Main Result

Theorem 1. Let $G$ be a regular $n$-vertex graph and let the initial sizes of the opinions be $C_{1}, C_{2}, \ldots, C_{k}$ in non-increasing order. Assume that $C_{1}-C_{2}$ is sufficiently large.

With probability at least $1-1 / n$, after a bounded number of rounds, the two-sample voting completes and the final opinion is the largest initial opinion.

Questions?

