# An Economic Model of Consensus on Distributed Ledgers

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### Byzantine Fault Tolerance (BFT) in Blockchains



# BFT is Older than Blockchains

- Classic problem with known solutions in distributed databases
  - going back to late 1970's
- Resurgence of interest
  - blockchains distributed ledgers
  - BFT protocols as guidance for designing blockchain protocols
- Crucial difference in adversarial environment
  - traditional distributed databases:
    - some nodes may fail or be hacked, others follow the protocol
  - blockchains:
    - nodes are independent entities, individually payoff-maximizing
    - every node decides whether it's worth for them to follow the protocol or deviate
  - need for economic incentives in analysis of BFT consensus

# Economic Model of BFT Consensus

- Characterize equilibria
  - not every design achieves consensus in presence of rational agents
  - designs differ in how costly they are
    - incentives  $\rightarrow$  cost of the system
- Show how the design of the protocol affects the system cost of incentives needed for consensus in equilibrium
- One example:
  - traditional (and current blockchain) BFT protocols recommend that nodes send and forward messages as much as they can
  - we show that in the presence of message loss, it may be prohibitively costly to achieve reliable consensus with such strategies
  - lowering the probability with which the message is sent achieves consensus at a lower system cost

# Byzantine Fault Tolerant (BFT) protocols

Classic problem in computer science (eg, Lamport, Shostak, Pease `82)

- Distributed computer nodes communicate with each other to ...
- Reach consensus based on "local" information (no "global" knowledge)
- Byzantine nodes behave arbitrarily
- Stipulate "honest" strategies for non-Byzantine nodes
- Widely used in tech companies to maintain distributed databases

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This paper (given that blockchains live in trustless environments)

- Non-Byzantine nodes are rational
- Ambiguity averse (Knightian uncertain) about Byzantine strategies



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  - decides, for each other node, whether to *forward* message;



A game among a measure of *n* computer nodes:

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- Leader decides, for each backup, whether to send a message;
  - e.g. new batch of transactions in a blockchain;
- Each backup receiving message from leader
  - decides, for each other node, whether to *forward* message;
- Each node then decides whether to *commit* message
  - based on its local information set.

For simplicity, we study one round of synchronous peer communication in a single view. Lamport, Shostak and Pease (1982) study f rounds. Castro and Liskov (1999) (PBFT) study two rounds of communication with view changes. We also assume adequately close message delivery speeds to justify simultaneous moves in each step.



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#### Two types of nodes

- Measure *f* of **Byzantine** nodes, who may take arbitrary actions;
- Measure *n*–*f* of **rational** nodes, who maximize utilities:

if consensus on messageSucceedsFailsCommit messageR > 0-c < 0</td>Not commit message00

Consensus succeeds iff "almost all" (measure n-f) rational nodes commit

- A dynamic game of imperfect info. ("coordination" & "cheap talk") Solution concept:
- perfect Bayesian eqm + multi-priors over Byzantine strategies



### Ambiguity aversion

- Rational nodes are ambiguity averse towards Byzantine strategies
  - "assume worst case scenario"
- Formally, a rational node i at any information set  $I_i$  facing all possible Byzantine strategies in  $\mathcal{B}$  chooses action  $a_i$  to maximize

 $\min_{\boldsymbol{B}\in\mathcal{B}} \mathbb{E}[u_i(a_i, A_{-i}; \boldsymbol{B})|I_i]$ 

# Characterizing all symmetric equilibria

Consider a candidate symmetric equilibrium in which

- a rational leader sends message to each backup with prob. p
- a rational backup forwards message (if received) with prob. q
- a backup commits iff receiving
   k ∈ E<sup>1</sup>⊂ [0, (n − f) q + f] messages, with one from the leader; or
   k ∈ E<sup>0</sup>⊂ [0, (n − f) q + f] messages, none of which is from the leader.
- If  $E^1 \cup E^0 = \emptyset$ , then a *gridlock equilibrium* (failed consensus)
- Our interest is in (successful) *consensus equilibrium* with *p* > 0 and *q* > 0









### The properties of a consensus equilibrium

A consensus equilibrium has

$$E^1 \cup E^0 = [(n-f)pq, (n-f)pq + fp]$$

A rational backup who knows the leader is Byzantine

- always gets -*c* from committing...
- thus does not commit
- except for when p = 1 and she receives exactly k = (n f)q + f messages























# All symmetric equilibria

- A "gridlock" equilibrium: discard communications and never commit
- Singleton- $E^0$ -equilibria indexed by  $q \in (0,1]$  when  $(n-f)R \ge fc$ :
  - A rational leader sends message to each backup with p = 1;
  - A rational backup forwards message (if received) with prob.  $q \in (0,1]$ ;
  - A rational backup commits *iff* receiving  $k \in [(n f)q, (n f)q + f]$  messages, with one from the leader or (n f)q + f messages without any from the leader, i.e.  $E^1 = [(n f)q, (n f)q + f]$  and  $E^0 = \{(n f)q + f\}$ .
- Interval- $E^0$ -equilibria indexed by  $p, q \in (0,1]$  when  $\frac{1}{2}(n-f)R \ge fc$ :
  - A rational leader sends message to each backup with prob.  $p \in \left[\frac{fc}{(n-f)R}, 1-\frac{fc}{(n-f)R}\right];$
  - A rational backup forwards message (if received) with prob.  $q \in (0,1]$ ;
  - A rational backup commits *iff* receiving  $k \in [(n f)pq, (n f)pq + fp]$  messages, receiving from the leader or not, i.e.  $E^0 = E^1 = [(n f)pq, (n f)pq + fp]$

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# Equilibria and Blockchain Protocol

- What does an existence (or not) of an equilibrium mean for blockchain protocol design?
- If the protocol prescribes p, q, E<sup>0</sup>, E<sup>1</sup>, c, R s.t. p, q, E<sup>0</sup>, E<sup>1</sup> is an equilibrium given n, f, c and R, then rational nodes have no incentive to deviate, and consensus is reached
- We can calculate the cost of incentives needed (*R*, *c*) to achieve consensus given *p* 
  - *singleton-E*<sup>0</sup>-eq'a require lower *R* than fractional-*p*-eq'a (for the same *c*)
  - for *interval-E*<sup>0</sup>-eq'a, *p* further from ½ requires higher *R*

### Interval-E<sup>0</sup> equilibria

- If message from the leader received, the expected payoff from committing:  $\frac{p(n-f)}{p(n-f)+f}R + \frac{f}{p(n-f)+f}(-c)$
- If message from the leader not received, the expected payoff from committing:

$$\frac{(1-p)(n-f)}{(1-p)(n-f)+f}R + \frac{f}{(1-p)(n-f)+f}(-c)$$

• For both to be positive, p cannot be too large or too small

• 
$$p \in \left[\frac{fc}{(n-f)R}, 1-\frac{fc}{(n-f)R}\right];$$
  
• and only when  $\frac{1}{2}(n-f)R \ge fc$ 

### Message losses

- All messages sent are delivered with prob.  $\alpha < 1$
- A "gridlock" equilibrium still exists
- Singleton-*E*<sup>0</sup>-equilibria no longer exist
- Interval- $E^0$ -equilibria require higher R/c to sustain for small  $\alpha$
- Supporting R/c regions expands as message loss prob.  $\alpha$  decreases

# Why does it matter?

- Operational success of any blockchain depends on its design.
- Accounting for incentives in BFT consensus:
  - All designs are subject to multiple equilibria concerns
    - gridlock equilibria always exist  $\Rightarrow$  possibility of system stuck
  - Small probability of message loss significantly affects equilibria
  - Provides guidance on **cost of incentives** needed to achieve consensus
    - Less costly when protocol asks for sending message with p=1/2
    - Recommendation different from traditional BFT