

# Using Proof-of-Work to Coordinate

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## The Two Generals Problem

**How can we coordinate our actions in a distributed setting?**

## Game-Theory Perspective: A First Take

If messenger #1 arrives safely

then both generals know the plan is to attack at dawn

If messenger #2 arrives safely

then both generals know that both generals know the plan

If messenger #3 arrives safely

then both generals know that both generals know that both generals know the plan

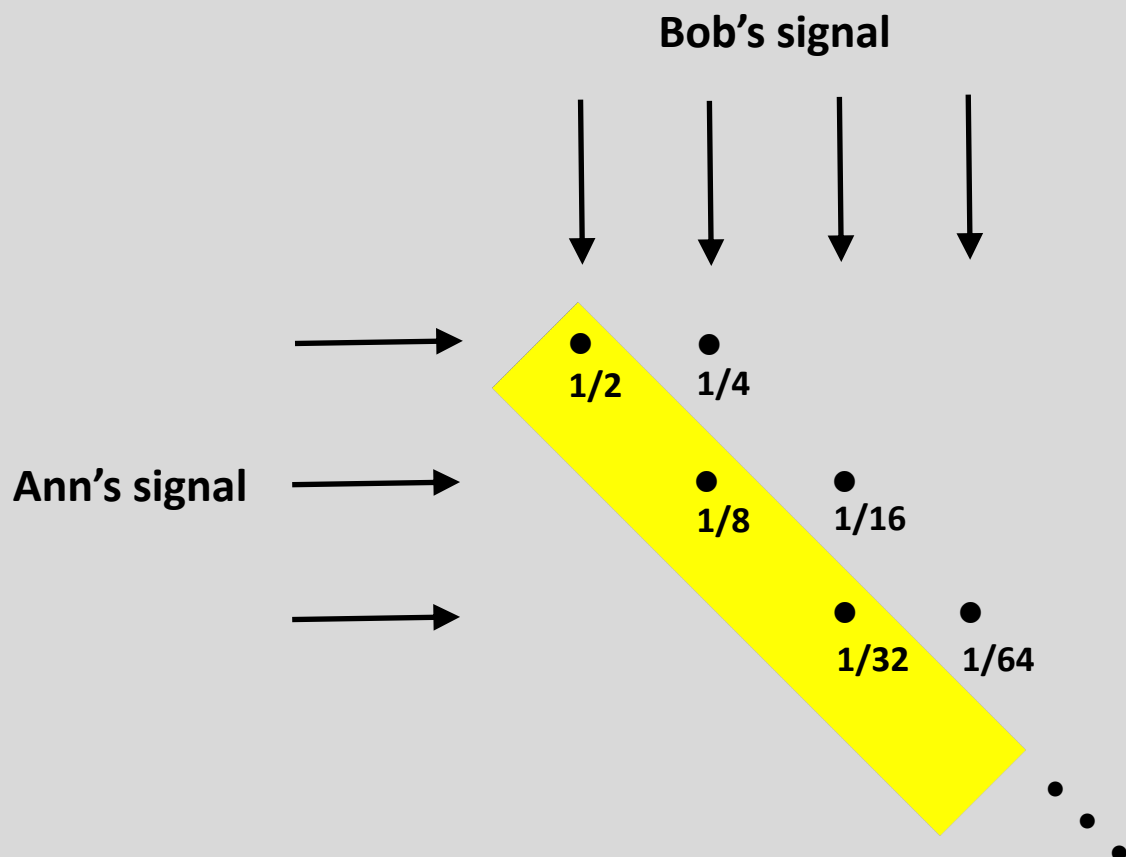
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No finite sequence of messages will achieve common knowledge of the plan

Implicitly, the view is that if the generals could achieve common knowledge of the plan, then they would attack --- but that even high-order mutual knowledge of the plan does not suffice

## Common Knowledge: A ‘Discontinuity at Infinity’

In game theory, the sensitivity of behavior to high-order mutual knowledge vs. common knowledge was first observed by Geanakoplos and Polemarchakis (1982) in the setting of the Agreement Theorem (Aumann, 1976)



## Common Knowledge contd.

Aumann and Brandenburger (1995) showed that common knowledge of the players' conjectures in a game (in the presence of other assumptions) yields Nash equilibrium, but high-order mutual knowledge does not



Rubinstein (1989) formalized the inadequacy of high-order mutual knowledge in a version of the Two Generals Problem (with uncertainty over the payoff functions)

## Game-Theory Perspective: A Second Take

In this talk, we present another game-theory formulation of the Two Generals Problem

This version is inspired by the emergence of blockchain (specifically, proof-of-work)

We will look for an approximate solution rather than an impossibility argument

“Every general, just by verifying the difficulty of the proof-of-work chain, can estimate how much parallel CPU power per hour was expended on it and see that it must have required the majority of the computers to produce that much proof-of-work in the allotted time.”

-- Satoshi Nakamoto

## A Coordination Game with an Uncertain Number of Active Players

Players may be inactive (and always choose  $\emptyset$ ) or active (and can choose  $c$  or  $\emptyset$ )

Coordination is positive only if there is a sufficient (expected) number of active players

	$c$	$\emptyset$
$c$	$3\alpha-1$ $3\alpha-1$ $3\alpha-1$	$2\alpha-1$ $0$ $2\alpha-1$
$\emptyset$	$0$ $2\alpha-1$ $2\alpha-1$	$0$ $0$ $\alpha-1$
	$c$	

	$c$	$\emptyset$
$c$	$2\alpha-1$ $2\alpha-1$ $0$	$\alpha-1$ $0$ $0$
$\emptyset$	$0$ $\alpha-1$ $0$	$0$ $0$ $0$
		$\emptyset$

The idea is that action  $c$  will be chosen if and only if

$$\alpha \times \text{expected number of active players} \geq 1$$

## Adding a Computational Puzzle to the Game

A computational puzzle is distributed to each active player at time 0

Each active player has a machine that works on the puzzle and finds the solution with Poisson arrival rate  $\lambda$  (independent across machines)

If a machine solves the puzzle, there is a delay until time  $T$ , when the solution is transmitted to all players

If no machine solves the puzzle by time  $T$ , a null message is transmitted to all players

The puzzle can be solved only by guesswork but the solution can be immediately verified



## Probability Calculations

Write the probability that  $k$  players are active, conditional on a solution by time  $T$ , as

$$\phi(k; T) = \frac{p_k [1 - \exp(-\lambda k T)]}{\sum_{i=1}^n p_i [1 - \exp(-\lambda i T)]}$$

We are interested in cases where

$$\alpha \sum_{k=1}^n k \cdot p_k < 1$$

but there is a (finite)  $T$  such that

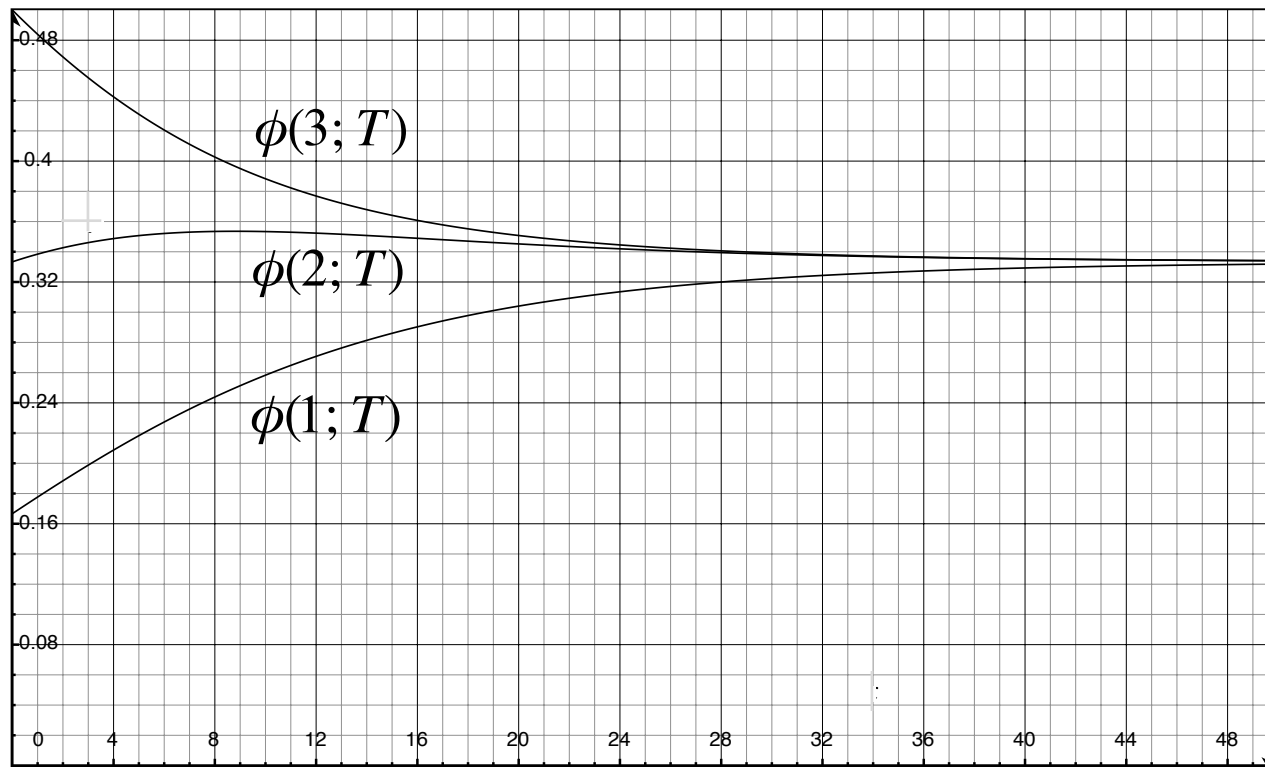
$$\alpha \sum_{k=1}^n k \cdot \phi(k; T) \geq 1$$

The idea is that we can choose a time  $T$  so that, if a solution is found by  $T$ , then there is a good chance that a good number of players are active

## Calculations with Three Players

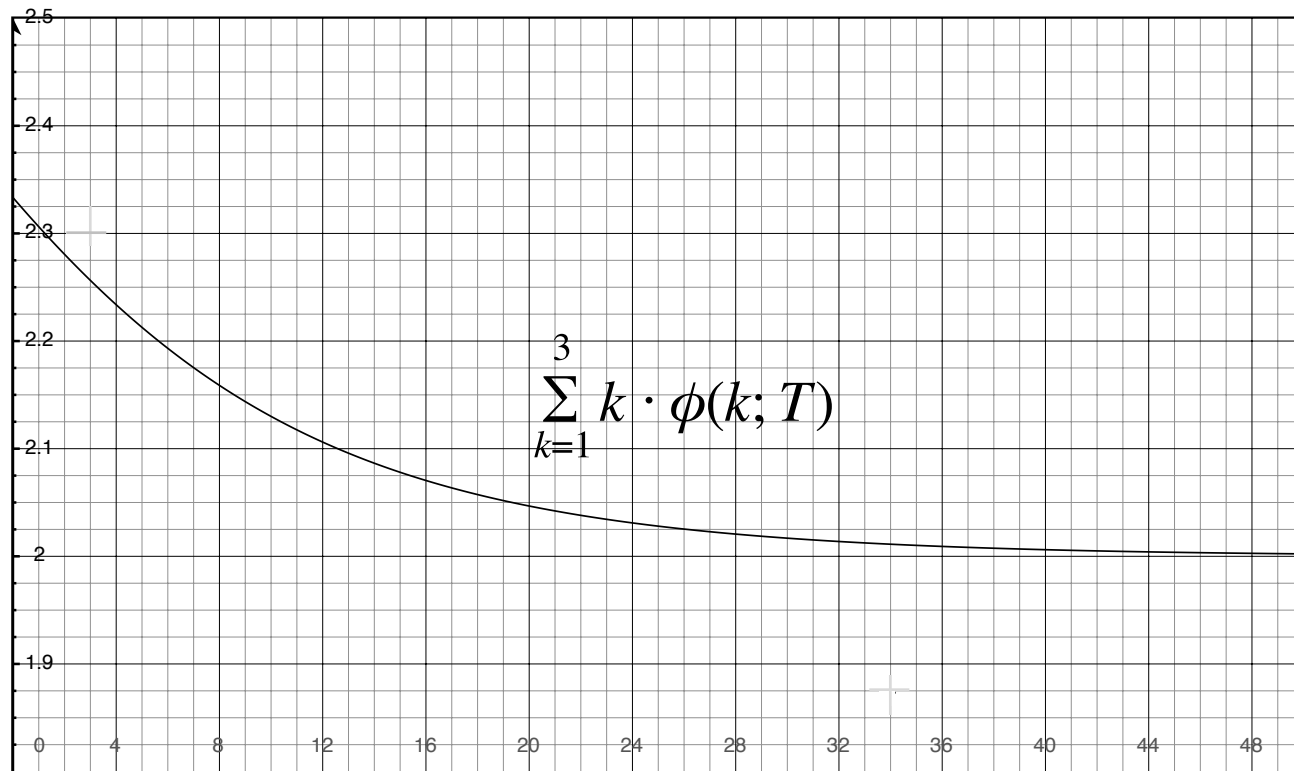
# of players  $n = 3$ ; arrival rate  $\lambda = 0.1$ ; uniform prior on # of active players

Probability that  $k$  players are active, conditional on a solution by  $T$ :



## Calculations with Three Players contd.

Expected number of active players, conditional on a solution by  $T$ :



## Proposition

If

$$\frac{\sum_{k=1}^n k p_k}{\sum_{k=1}^n k^2 p_k} < \alpha < \frac{1}{\sum_{k=1}^n k p_k}$$

then coordination does not happen without the computational puzzle but can happen, for sufficiently small  $T$ , with the computational puzzle

To do:

Design a protocol that ensures a player can be active if and only if that player works on the puzzle

Design a mechanism that balances the benefits and costs of different choices of time duration  $T$  (and  $\lambda$ )

## Back to Common Knowledge

At time  $T$ , if the computational puzzle is solved, then each (active) player assigns some --- possibly, large --- probability to the event that the puzzle was distributed to a large number of other players

Suppose the puzzle came attached to an underlying statement  $S$  of interest

Then, depending on how long  $T$  is, we may be able to say that each player 'approximately knows' that a large number of players know  $S$

We can iterate this process by next distributing a message consisting of  $S$ , the original puzzle, the solution, and a new puzzle

If, at a time  $T^*$ , the new puzzle is solved, we may be able to say that each player approximately knows that a large number of players approximately know that a large number of players know  $S$

...

Such higher-order (approximate) knowledge did not play a formal role in the coordination game, but could be important in other applications

## The Two Generals Problem



**Solved (to some degree)!**