Algorithms and Distributed Systems 2019/2020 (Lecture Six)

> MIEI - Integrated Master in Computer Science and Informatics Specialization block

João Leitão (jc.leitao@fct.unl.pt)



## Lecture structure:

- FLP
- Paxos

## Last Lecture...

- We have started to study the Consensus Problem
  - C1 Termination: Every correct process eventually decides a value.
  - C2 Validity: If a process decides v, then v was proposed by some process.
  - C3 Integrity: No process decides twice.
  - C4 Uniform Agreement: No two processes decide differently.
- We studied two algorithms for the synchronous system (For regular and uniform consensus)

# Solving Consensus on an Asynchronous System

• What is your best proposal for solving consensus in an asynchronous system where processes may fail (Crash fault model)?

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## FLP

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#### Impossibility of Distributed Consensus with One Faulty Process

MICHAEL J. FISCHER

Yale University, New Haven, Connecticut

NANCY A. LYNCH

Massachusetts Institute of Technology, Cambridge, Massachusetts

AND

MICHAEL S. PATERSON

University of Warwick, Coventry, England

## FLP

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• There is no deterministic protocol that solves consensus in an asynchronous system in which a single process may fail by crashing.

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- How do we demonstrate this?
- By contradiction and through an indistinguishability argument.

## System trace

- A system trace is a way to model the execution of a distributed system considering only its *externally observable behaviour* where:
  - Only inputs and outputs are considered.
  - We fully abstract the internal state of each process.
- Notation is usually: Process Identifier: Action
- E.g.:
  - P1: Proposes(v), P2:Proposes(v'), P1:Decides(v), P2: Decides(v)

- Let's consider two sets of processes of arbitrary size (with at least one process): A and B
- Now let's assume that there exists a deterministic algorithm that solves consensus.
- Let's build a few traces of the execution of such system (in an asynchronous system under the crash fault model).

- The Proof itself involves an initial step that is to prove that the output of consensus must depend on the ordering of messages exchanged among processes.
- This can be done by leveraging the property:

C2 Validity: If a process decides v, then v was
proposed by some process.

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**Regular Consensus Specification:** 

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  - All processes in A propose v at time  $t_1 (t_1 > t_0)$ .

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- Trace: B:Crash(), A:Propose(v), A:Decide(v)

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- Run Two:
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  - All processes in B propose v' at time  $t_1 (t_1 > t_0)$ .

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- Run Three:
  - Messages between processes in A and B are delayed up to some time t<sub>5</sub> (t<sub>5</sub> > t<sub>4</sub> and t5 > t<sub>3</sub>).
  - All processes in A propose v at some time t<sub>1</sub>.
  - All processes in B propose v' at some time  $t_1 (v != v')$ .

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  - All processes in B propose v' at some time  $t_1 (v != v')$ .
  - By indistinguishability with Run One processes in A decide v at some time t<sub>2</sub> (t<sub>2</sub> > t<sub>1</sub>).
  - By indistinguishability with Run Two processes in B decide v' at some time t<sub>3</sub> (t<sub>3</sub> > t<sub>1</sub>).

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#### Trace:

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**Contradition:** Hence our base assumption that there is a deterministic algorithm that solves consensus (in asynchronous systems where a process can crash) must be false.

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## FLP: Secondary Result (Positive Result)

• There are deterministic protocols that solve consensus in an asynchronous system when no process crashes during the execution of the algorithm.

- Consensus is not solvable (by a deterministic algorithm) in asynchronous systems under the crash fault model.
- What about equivalent problems to consensus?

- A problem that has been demonstrated to be equivalent to consensus: Total Order Broadcast
- Total Order Broadcast Specification:
  - TO (Total Order): Let m<sub>1</sub> and m<sub>2</sub> be any two messages. Let p<sub>i</sub> and p<sub>j</sub> be any two correct processes that deliver m<sub>1</sub> and m<sub>2</sub>. If p<sub>i</sub> delivers m<sub>1</sub> before m<sub>2</sub>, then p<sub>j</sub> delivers m<sub>1</sub> before m<sub>2</sub>.
  - RB1 (Validity): If a correct process i broadcasts message m, then i eventually delivers the message.
  - RB2 (No Duplications): No message is delivered more than once.
  - RB3 (No Creation): If a correct process j delivers a message m, then m was broadcast to j by some process i.
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  - If you have total order broadcast, then you can solve the consensus problem.

- A problem that has been demonstrated to be equivalent to consensus: Total Order Broadcast
- Equivalent implies that:
  - If you have consensus, then you can solve the total order broadcast problem.
  - If you have total order broadcast, then you can solve the consensus problem.
- Bad News: Since the problems are equivalent the FLP result also applies to Total Order Broadcast.

 State machine replication requires either Consensus or Total Order Broadcast (trivial to demonstrate the second, since they are equivalent ©).

The World is asynchronous...

...so there goes state machine replication down the drain!



### And so are distributed systems in practice?

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- So this is done right?
- We cannot do anything... maybe lets cancel this course... Go home... And think about the vacum of Human and distributed systems existence?
- Not so fast: We can always **circumvent (i.e, go around)** the impossibility result.
- But how?

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- Technique 1: Let's use a probabilistic algorithm that ensures termination with high probability (but not for sure).

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- Technique 2: Let's relax the agreement and validity properties such that there must exist proposed values by at least k (k<n) processes, and we only decide values with this property.

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- Technique 3: Let's modify our system model to say that there is this "magic abstraction" that allows us to detect process failures (failure detectors). (Interesting question: what are the minimum guarantees that a fault detector has to provide for consensus to be solvable?)

- By relaxing the specification of Consensus obviously...
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- Technique 4: Let's relax the termination property such that we "only ensure" termination if the system behaves in a synchronous way (so no termination at all).

#### Exploring alternative 4: Paxos

- Solves (a weaker variant of) Consensus in asynchronous systems under crash fault model.
- Termination can only be achieved in periods where the system behaves in a synchronous way.
- Used in practice: Google, Yahoo!, Microsoft, Amazon, etc.



#### Exploring alternative 4: Paxos



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• Leslie Lamport. **1998**. The part-time parliament. *ACM Trans. Comput. Syst.* 16, 2 (May 1998), 133-169.

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- Leslie Lamport. Paxos made simple. ACM SIGACT News (Distributed Computing Column) 32, 4 (Whole Number 121, December 2001)

- Leslie Lamport. 1998. The part-time
  - At the PODC 2001 conference, I got tired of everyone saying how difficult it was to understand the Paxos algorithm, published in [122]. Although people got so hung up in the pseudo-Greek names that they
- found the paper hard to understand, the algorithm itself is very simple.
  So, I cornered a couple of people at the conference and explained the algorithm to them orally, with no paper. When I got home, I wrote down the explanation as a short note, which I later revised based on comments from Fred Schneider and Butler Lampson. The current version is 13 pages long, and contains no formula more complicated than n1 > n2.
  - -- From Leslie Lamport page.

- Leslie Lamport. **1998**. The part-time parliament. *ACM Trans. Comput. Syst.* 16, 2 (May 1998), 133-169.
- Leslie Lamport. Paxos made simple. ACM SIGACT News (Distributed Computing Column) 32, 4 (Whole Number 121, December 2001)
- Robbert Van Renesse and Deniz Altinbuken. 2015.
  Paxos Made Moderately Complex. ACM Comput. Surv. 47, 3, Article 42 (February 2015), 36 pages.

#### Paxos: Consensus Specification

- C2 Validity: If a process decides v, then v was proposed by some process.
- C3 Integrity: No process decides twice.
- C4 Agreement: No two correct processes decide differently.

#### Paxos: Assumptions

- Asynchronous System
- Messages exchanged among processes can be lost, duplicated, but never corrupted.
- Processes can fail by crash and recover at some point in the future (crash-recovery fault model).
  - Each process has access to persistent storage (e.g., hard disk) that 'survives' to a crash.

#### Paxos: Separation of Roles

- 3 different types of processes:
  - Proposers: Propose values
  - Acceptors: Accept proposed values.
  - Learners: Learn decided values.
- In practice these three roles can be executed together in a single machine
  - A process can have and execute all three roles simultaneously.

#### **Trivial Solution: Single Acceptor**



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### Paxos: Tolerating failure of the Acceptor (Through Replication)



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- Problem: different acceptors might receive proposals in a different order, so when can they make a "final" decision?
- Suggestion: Lets think in this in terms of quorums...
- Decision is made when a majority accepts the same value, this will ensure an intersection as in a majority-based quorum.

5 3 9 5 5 9 When there is a majority, 5 then we can make a decision

Acceptors

Learners

Proposers

Acceptors

Learners



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 Acceptors must be able to accept more than one proposal (i.e., more than one value, meaning that they might change their opinion regarding the value that is going to be decided).

### How to deal with multiple (concurrent) proposals?

- Acceptors must be able to accept more than one proposal (i.e., more than one value, meaning that they might change their opinion regarding the value that is going to be decided).
- Each proposal will be enriched with a sequence number that allows to distinguish different proposal and order them.
  - Proposal = (psn, value)
  - All proposals have a different proposal sequence number (psn)
  - Definition: a proposal (meaning a pair (psn, value)) is considered selected when it is accepted by a majority of acceptors (f < N/2).</li>
    - At this point learns can declare the decided value.
- Sequence numbers can be generated by each proposal by using its identifiers (1..N, where N is the number of proposers) and adding N whenever it needs a new sequence number.

#### Proposers

Acceptors

Learners

So now acceptors can accept any proposal if the psn is greater than the previously accepted proposal. Will this work?









### When should an acceptor change its accepted proposal?

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• If an acceptor changes its currently accepted proposal just because it receives a proposal with a higher sequence number, more than one value can be decided (violating the definition of consensus). When should an acceptor change its accepted proposal?

- If an acceptor changes its currently accepted proposal just because it receives a proposal with a higher sequence number, more than one value can be decided (violating the definition of consensus).
- The trick is to avoid an acceptor to change its accepted proposal if there is already a proposal that was accepted by a majority (and hence decided).
- A value in a proposal that was accepted by a majority of acceptors is said to be **locked-in**.

### Problelm of acceptors changing previously accepted proposal.



#### What is the solution for this?

- Intuitively, an acceptor could safely accept another proposal if the sequence number of that proposal is higher than the previously accepted proposal and:
  - 1. If there is no previously locked-in value, then that proposal can propose any value to be decided by consensus.
  - 2. If there is already a locked-in value *v*, then the new proposal also proposes *v* (this will ensure that two different values cannot be decided).

#### What is the solution for this?

- We must delegate in the proposers the responsibility to check if a value has already been locked-in before they make their propose.
- If no value has been locked-in, then the proposer can propose its initial value to be decided.
- If some value v has been already locked-in, then the proposer **must** propose that value.
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- If some value v has been already locked-in, then the proposer **must** propose that value.
- This can be achieved by having the proposer read accepted values from a majority of acceptors.

















## What did we do there?

- Assume that proposer p wants to emit a proposal with psn<sub>i.</sub>
- If p can be sure that there is no other proposal with psn<sub>j</sub>, such that psn<sub>j</sub> < psn<sub>i</sub>, and value v' that was not decided then he can propose his initial value v.
- Otherwise, p must propose value v' that was already locked in.
- To do so, the proposer checks selected proposals from a majority of acceptors, and if there is a proposal already there, he changes his proposed value to the value in the proposal with largest psn<sub>j</sub> (might not be locked-in yet, but is safe).

Proposers

Acceptors

Learners

(1,3) (3,9) (2,5)		et's try a different execution	











## What went wrong there?

- By checking if some proposal was already selected in a majority of acceptors, the proposer can be sure that things in his past (i.e., proposals with psn below his own) have not yet locked-in a value...
- However, this does not provides a guaranteee to the proposer that in the future there will be no proposal with a psn below his own that will lock-in a value.

## What went wrong there?

- By checking if some proposal was already selected in a majority of acceptors, the proposer can be sure that things in his past (i.e., proposals with psn below his own) have not yet locked-in a value...
- However, this does not provides a guaranteee to the proposer that in the future there will bo no proposal with a psn below his own that will lock-in a value.
- In some sense we covered the past, but we also need to make sure that proposals with lower psn cannot affect the future. How to do this?

# Ensuring that the past no longer affects the future...

- Future manipulation is tricky, and the proposer on its own will not be able to control it.
- We need to get assistance from the acceptors.
- In particular, when the proposer checks if there is already a locked-in value, he can inform the acceptors (a majority in this case) of the sequence number that he is planning on using. Acceptor that reply to him also promise to not accept any proposal with a psn below that one (hence the past cannot affect the future)











## Why does this work?

 When a proposer gathers a majority quorum from acceptors that promise that they will not accept a proposal with a lower psn than his own, it makes it impossible for such a proposal value to be decided (since a majority that will accept a proposal with a lower sequence number becomes impossible to obtain).

## Why does this work?

- When a proposer gathers a majority quorum from acceptor that promise that they will not accept a proposal with a psn lower than his own, it makes it impossible for such a proposal value to be decided (since a majority that will accept a proposal with a lower sequence number becomes impossible to obtain).
- From a practical standpoint, this ensures that if a proposer effectively proposes his initial value, then no proposal with a lower sequence number exists that was already accepted by a majority of acceptor or will ever be accepted by such a majority.

#### Proposer Algorithm

```
PROPOSE(v)
    choose unique n, higher than any n seen so far
    send PREPARE(n) to all nodes
    if PREPARE_OK(na, va) from majority then
        va = va with highest na (or choose v
    otherwise)
    send ACCEPT (n, va) to all
    if ACCEPT_OK(n) from majority then
        send DECIDED(va) to all
```

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if ACCEPT_OK(n) from majority then
send DECIDED(va) to all
```

Evidently, if no valid quorum is gathered of either PREPARE\_OK or ACCEPT\_OK messages, the proposer should timeout and reset this algorithm using a larger sequence number (n).

#### Acceptor Algorithm

```
State: np (highest prepare), na, va (highest accept)
/* This state is maintained in stable storage */
```

```
PREPARE(n)
if n > np then
np = n // will not accept with seq. nub. < n
reply <PREPARE_OK,na,va>
ACCEPT(n, v)
if n >= np then
na = n
va = v
reply with <ACCEPT_OK,n>
```











#### Learners

- Learns can either contact acceptors or be contacted by acceptors to know the value that they have selected.
- When a majority of acceptors select the same value then a decision can be made.

## Liveness is not guaranteed (Termination Property)



• To ensure liveness (termination) there must be a ever single proposer (leader). This is only possible if a long enough period of synchrony happens in the system.
## Homework 3:

- Use paxos to build a total order broadcast protocol that operates in an asynchronous system model under the crash fault model:
  - TO (Total Order): Let m<sub>1</sub> and m<sub>2</sub> be any two messages. Let p<sub>i</sub> and p<sub>j</sub> be any two correct processes that deliver m<sub>1</sub> and m<sub>2</sub>. If p<sub>i</sub> delivers m<sub>1</sub> before m<sub>2</sub>, then p<sub>j</sub> delivers m<sub>1</sub> before m<sub>2</sub>.
  - RB1 (Validity): If a correct process i broadcasts message m, then i eventually delivers the message.
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- You can use up to two primitives (paxos is mandatory):
  - Paxos
    - - Request: pprepare( v )
    - Indication: pdecided(v)
  - Reliable Broadcast
    - - Request: broadcast( m )
    - - Indication: deliver(m)

Interface of your protocol:

Request: - tobcast( m ) Indication: - todeliver ( m )