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# Programming Distributed Systems Fault-tolerance in Message-Passing Distributed Systems

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## The Need for Distributed Algorithms

- Distributed algorithms are at the core of any distributed systems
- Implemented as middelware between network and application
- Services beyond network protocols (e.g. TCP, UDP)
	- Group communication
	- **Shared memory abstractions**
	- Replicated state machines



## **Overview**

- Formal models for specifying and analyzing distributed algorithms  $\mathcal{L}_{\mathcal{A}}$
- Composability of distributed algorithms **Tale**
- The Broadcast Problem m.
	- **Best-effort broadcast**
	- Reliable broadcast
	- **FIFO** broadcast
	- Causal broadcast
	- Total-Order broadcast



## Goals of this Learning Path

In this learning path, you will learn

- to formally specify safety and liveness properties of several broadcast problem
- to define fault-tolerant algorithms for Best-effort, Reliable, FIFO and Causal Broadcast in an asynchronous system with reliable channels
- $\blacksquare$  to prove the correctness of these algorithms
- to use space-time diagrams to visualize executions
- to implement these algorithms in Erlang



### The Broadcast Problem

#### Informally: A process needs to transmit a message other processes.

broadcast(m)  $\approx$  for each  $j \in \{1, ..., n\}$ : send m to  $p_j$ 



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## System model

- **Asynchronous system** 
	- no upper bound on message transfer delay
	- no failure detectors
- Static set of processes  $\Pi = \{p_1, \ldots, p_n\}$ 
	- crash-stop fault model
- Sending and receiving messages through reliable channels (perfect point-to-point links)
	- no message loss / creation / modification / duplication
	- **bidirectional**
	- $\blacksquare$  infinite capacity
- **Messages are uniquely identifiable** 
	- e.g. tag with <sender, seq\_number>

Only a subset  $\Pi' \subseteq \Pi$  receives messages in arbitrary order at distinct, independent time instants.



### What is the simplest solution that you can think of?



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Just go ahead and send the message to everyone, one at a time.



## Specifying the Broadcast Algorithms

Wait... How do you specify an algorithm for a process again?



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Wait... How do you specify an algorithm for a process again?

 $\Rightarrow$  Deterministic I/O automaton with send/receive operations!

Events: Messages, timers, conditions,  $\dots$ **Exent-driven interface** 

```
Upon Event(arg1, arg2, ...) do:
  // local computation
  trigger Event(arg1', arg2',...)
```
■ Correctness properties

- Safety: Nothing bad ever happens
- **Liveness: Something good eventually happens**



## The Anatomy of a Broadcast Algorithm

For the broadcast algorithms:

**Upon** Init **do**: ... **Upon** Broadcast(m) **do**: ... **Upon** Receive(*pk*, m) **do**: ...

■ You can trigger an event on another layer:

```
trigger Send(pj, m)
trigger Deliver(pk, m)
```
 $\blacksquare$  There is a special event called  $\text{Init}$  for initializing the local state.  $\blacksquare$   $p_i$  denotes the target process when sending a message  $\blacksquare$   $p_k$  denotes the process where the message originated from



## At Process *p<sup>i</sup>*

#### Application layer





## Best-effort Broadcast (BEB): Specification

**BEB-Validity:** If a correct process  $p_j$  beb-delivers a message  $m$ , then  $m$  has previously been beb-broadcast to  $p_j$  by some process *pi* .

No creation, no alteration of messages

- **BEB-Integrity:** A process beb-delivers a message m at most once. No duplication of messages
- **BEB-Termination:** For any two **correct** processes  $p_i$  and  $p_j$ , every message that has been beb-broadcast by  $p_i$  is eventually beb-delivered by *p<sup>j</sup>* .



### Best-effort Broadcast: Algorithm

Idea:

- Just go ahead and send the message to every other process.
- When you get one of these messages, you deliver it to the upper layer.
- Intuition: No guarantees if sender crashes



Network layer



# Best-effort Broadcast: Correctness

Why does it work?

- BEB-Validity holds because Perfect-Link model guarantees no creation and there is no other way for messages to appear, only through beb-broadcast
- **BEB-Integrity holds because Perfect-Link model guarantees no** duplication
- **BEB-Termination holds because Perfect-Link model guarantees** reliable delivery

#### Perfect-Link Model

- **Reliable Delivery**: Considering two correct processes *i* and *j*; if *i* sends a message *m* to *j*, then *j* eventually delivers *m*.
- **No Duplication**: No message is delivered by a process more than once.
- **No Creation**: If a correct process *j* delivers a message *m*, then *m* was sent to *j* by some process *i*.



## Visualizing Executions with Space-Time Diagrams



- $\Box \downarrow m =$  broadcast message m
- $\blacksquare$   $\uparrow$  *m* = deliver message *m*



### Best-effort Broadcast: Sender crashes





### Limitations of Best-effort Broadcast

What happens if a process fails while sending a message?

- If the sender crashes before being able to send the message to all processes, some process will not deliver the message.
- Even in the absence of communication failures!



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- Even in the absence of communication failures!

Let's try for a reliable version of broadcast!

- Guarantees that all or none of the correct nodes gets the message
- **Exen if sender crashes!**



## Reliable Broadcast (RB): Specification

- RB-Validity: If a correct process  $p_i$  rb-delivers a message  $m$ , then *m* has been previously rb-broadcast.
- RB-Integrity: A process rb-delivers a message m at most once.
- RB-Termination-1: If a correct process  $p_i$  rb-broadcasts message *m*, then *p<sup>i</sup>* rb-delivers the message *m*.
- RB-Termination-2: If a correct process  $p_i$  rb-delivers a message  $m$ , then each correct process rb-delivers *m*.









Not possible under Reliable Broadcast: RB-Termination-2 is violated!

If correct process  $p_2$  delivers  $m$ , then correct process  $p_3$  must also rb-deliver *m*.









The fact that process  $p_1$  does not deliver  $m_2$  is not a problem, because only correct processes are required to deliver their own messages.









The fact that no process delivers  $m_2$  is not a problem, because process  $p_1$  has crashed and no process delivers  $m_2$ .



### Reliable Broadcast: Idea!





## Reliable Broadcast: Algorithm

#### **State**:

```
delivered //set of message ids
  that have already been delivered
```
**Upon** Init **do**: delivered **<-** ∅

```
Upon rb-broadcast(m) do
 mid <- generateUniqueID(m)
  trigger beb-broadcast([mid, m])
```

```
Upon beb-deliver(pk, [mid, m]) do
  if ( m_{id} \notin \text{delivered} ) then
    delivered <- delivered ∪ {mid}
    trigger rb-deliver(pk, m)
    trigger beb-broadcast([mid, m])
```


Application layer



### Reliable Broadcast: Correctness

■ RB-Validity: If a correct process  $p_i$  rb-delivers a message  $m$ , then *m* has previously been rb-broadcast.

- **By BEB-Validity.**
- RB-Integrity: A process rb-delivers a message *m* at most once.
	- By BEB-Integrity and handling the set of delivered messages.
- RB-Termination-1: If a correct process  $p_i$  broadcasts message  $m$ , then *p<sup>i</sup>* eventually rb-delivers *m*.
	- By BEB-Termination and handling of the set of delivered messages.
- RB-Termination-2: If a correct process  $p_i$  rb-delivers a message  $m$ , then each correct process rb-delivers *m*.
	- After rb-delivering *m*, a correct process forwards *m* to all processes. By BEB-Termination and *p<sup>i</sup>* being correct, all correct processes will eventually beb-deliver *m* and hence rb-deliver it.









The fact that  $m_2$  has been delivered by faulty  $p_1$  and  $p_2$  does not imply that  $m_2$  has to be delivered by  $p_3$  as well. Yet, this situation is not desirable, because two processes deliver something and another one does not.

 $\Rightarrow$  Interaction with external world!



## Uniform Reliable Broadcast (URB): Specification

- URB-Validity: If a correct process  $p_i$  urb-delivers a message  $m$ , then *m* was urb-broadcast to  $p_i$  by some process  $p_j$ .
- URB-Integrity: A process  $p_i$  urb-delivers a message m at most once.
- URB-Termination-1: If a correct process  $p_i$  urb-broadcasts a message *m*, then *p<sup>i</sup>* eventually urb-delivers *m*.
- URB-Termination-2: If a process *p<sup>i</sup>* urb-delivers a message *m*, then each correct process *p<sup>j</sup>* eventually urb-delivers *m*.



## An Impossibility Result

- *n*: total number of processes
- *t*: upper bound on the number of processes that can fail
- Fail-silent system model: crash-stop  $+$  perfect point-to-point links

#### Theorem

There is no algorithm implementing URB under the fail-silent system model if a majority of processes can fail, i.e. if  $t \geq n/2$ .



## Proof sketch

By contradiction.

- Assume there exists algorithm A that implements URB under the fail-silent model for  $t > n/2$ .
- **Partition**  $\Pi = P_1 \cup P_2$  such that

$$
P_1 \cap P_2 = \emptyset
$$

$$
|P_1| = \lceil n/2 \rceil \text{ and } |P_2| = \lfloor n/2 \rfloor (|P_1| \ge |P_2|)
$$

Consider two executions  $E_1$  and  $E_2$ 

#### Execution  $E_1$ :

- All  $p_i \in P_2$  crash initially, all processes in  $P_1$  are correct.
- $p_x \in P_1$  issues urb-broacast $(m)$  using algorithm *A*
- Every process in  $P_1$  urb-delivers  $m$



# Proof sketch (2)

#### **Execution**  $E_2$ :

- $\blacksquare$  No  $p_i \in P_2$  crashes, and none of them issues urb-broadcast.
- All processes in  $P_1$  are correct.
- $p_x \in P_1$  issues urb-broacast $(m)$  using algorithm *A*
- **E** Every process in  $P_1$  urb-delivers  $m$  and then crashes
- $\blacksquare$  Now, *m* is lost and can't be urb-delivered by processes in  $P_2$ , because perfect-link model requires sender and receiver to be correct for reliable delivery.
- $E_1$  and  $E_2$  are indistiguishable by algorithm A.



### Uniform Reliable Broadcast for *t < n/*2: Algorithm

#### **State**:

delivered //set of message ids that have already been delivered pending // set of messages to be delivered ack // map *mid* to received acknowledgments

```
Upon Init do:
  delivered, pending <- ∅
  \forall m_{id}: \text{ack}[m_{id}] = \emptysetUpon urb-broadcast(m) do
  mid <- generateUniqueID(m)
  pending <- pending ∪ {mid}
  trigger beb-broadcast([self, mid, m])
```


## Uniform Reliable Broadcast for *t < n/*2: Algorithm (2)

```
Upon beb-deliver(pk, [pj, mid, m]) do
  ack[m_{id}] \leftarrow \text{ack}[m_{id}] \cup \{k\}if ( (p_i, m_{id}, m) \notin pending ) then
    pending \leftarrow pending ∪ (p_i, m_{id}, m)
     trigger beb-broadcast([pj, mid, m])
```

```
Upon exists (p_i, m_{id}, m) \in \text{pending}with ack[m_{id}] > n/2 and m_{id} \notin delivered
  delivered <- delivered ∪ mid
  trigger urb-deliver(pj, m)
```


### Uniform Reliable Broadcast: Correctness

- Assume majority of correct processes (*t* < *n*/2)
- If a process urb-delivers, it got acknowledgement from majority
- In this majority, at least one process *p* must be correct
- *p* ensures that all correct processes beb-deliver *m*
- These correct processes (majority!) will ack and urb-deliver the message



## Resilience

- Defined by maximum number of faulty processes an algorithm can handle
- Algorithm for URB under fail-silent model has resilience *< n/*2



## Problem: Message ordering

- Given the asynchronous nature of distributed systems, messages  $\mathcal{L}_{\mathcal{A}}$ may be delivered in any order.
- Some services, such as replication, need messages to be delivered in a consistent manner, otherwise replicas may diverge.



## FIFO Order



### FIFO Property

If a process *p* broadcasts a message *m* before the same process broadcasts another message  $m'$ , then no correct process  $q$  delivers  $m'$  unless it has previously delivered *m*.

$$
broadcast_p(m) \rightarrow broadcast_p(m') \Rightarrow deliver_q(m) \rightarrow deliver_q(m')
$$



## Causal Order



#### Causality Property

If the broadcast of a message *m* happens-before the broadcast of some message  $m'$ , then no correct process delivers  $m'$  unless it has previously delivered *m*.

 $broadcast_p(m) \rightarrow broadcast_q(m') \Rightarrow deliver_r(m) \rightarrow deliver_r(m')$ 



## Total Order

#### Total Order Property

If correct processes  $p$  and  $q$  both deliver messages  $m, m'$ , then  $p$ delivers  $m$  before  $m'$  if and only if  $q$  delivers  $m$  before  $m'.$ 

 $deliver_p(m) \rightarrow deliver_p(m') \Rightarrow deliver_q(m) \rightarrow deliver_q(m')$ 



### Message ordering: Quizzzzz



Is this allowed under FIFO Order, Causal Order, Total Order?

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# (Reliable) FIFO Broadcast (FIFO): Specification

- All properties from reliable broadcast
- FIFO delivery: If a process fifo-broadcasts  $m$  and later  $m'$ , then no process fifo-delivers *m*<sup>0</sup> unless it already delivered *m*.



# FIFO-Broadcast: Algorithm **State**:

```
next // array mapping process id to seq numer
  seq // sequence numbers for broadcast messages
  pending // messages to be delivered
Upon Init do:
  next <- [0, ..., 0]
  seq <- 0
  pending <- ∅
Upon fifo-broadcast(m) do
  mid <- seq++ // generate next seq number
  trigger rb-broadcast([mid , m])
Upon rb-deliver(pk, [mid, m]) do
  \mathbf{if} m_{i,j} = \text{next}[p_k] then
    trigger fifo-deliver(pk, m)
    next[p_k]++while exists (p_k, n_{id}, n) \in \text{pending with } n_{id} = \text{next}[p_k] do
      trigger fifo-deliver(pk, n)
      next[p_k]++pending \leftarrow pending \setminus {(p_k, n_{id}, n)}
  else pending \leftarrow pending ∪ {(p_k, m_{id}, m)}
```
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## (Reliable) Causal Broadcast (RCO): Specification

- **All properties from reliable broadcast**
- Gausal delivery: No process  $p_i$  delivers a message  $m'$  unless  $p_i$  has already delivered every message  $m$  such that  $m \to m'.$

#### Idea

- **Each messages carries**  $_{\text{past}_{m}}$ , an ordered list of messages that causally precede *m*
- When a process rb-delivers *m*,
	- it co-delivers first all causally preceding messages in  $past_m$
	- it co-delivers  $m$
	- **avoiding duplicates using delivered**



# Causal Broadcast (RCO): Algorithm 1 (No-waiting)

```
State:
   delivered //set of messages ids that were already rco-delivered
   past // ordered list
 Upon Init do:
   delivered <- ∅
   past <- []
 Upon rco-broadcast(m) do
   mid <- generateUniqueID(m)
   trigger rb-broadcast([mid , past, m])
   past \leq past ++ [(self, m_{id}, m)] // append at the end
 Upon rb-deliver(pk, [mid, pastm, m]) do
   if ( m_{id} \notin \text{delivered} ) then
     for (p_i, n_{id}, n) : past<sub>m</sub> do // from old to recent
        if (n_{id} \notin \text{delivered}) then
          trigger rco-deliver(pj, n)
          delivered <- delivered ∪ {nid}
          if (p_i, n_{id}, n) \notin past then
              past <- past ++ [(pj, nid, n)]
     trigger rco-deliver(pk, m)
     delivered <- delivered ∪ {mid}
     if (p_k, m_{id}, m) \notin past then
          past <- past ++ [(pk, mid, m)]
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```


### Causal Broadcast: Scenario 1





### Causal Broadcast - Algorithm 1: Correctness

- Validity follows directly from rb-broadcast
- Integrity follows from rb-broadcast and the check before rco-delivering messages from past *m*
- Termination follows directly from rb-broadcast and the fact that no waiting occurs
	- Every message is rco-delivered once rb-delivered
- Causal delivery
	- **Each message**  $m$  carries its causal past
	- Causal past is in order delivered before *m*
	- **Proof by induction on trace prefix** 
		- **Initial state**
		- For every delivery



## Remarks

- Message from causal past of *m* are delivered before message *m* **Tale** (causal delivery)
- **Message id's could be reused for rb-broadcast**
- Size of messages grows linearly with every message that is broadcast since it includes the complete causal past



### Idea: Garbage collect the causal past

- If we know when a process fails (i.e., under the fail-stop model), we can remove messages from the causal past.
- When a process rb-delivers a message *m*, it rb-broadcasts an acknowledgement message to all other processes.
- When an acknowledgement for message m has been rb-delivered by all correct processes, *m* is removed from *past*
- $\,N^2$  additional ack messages for each application message
- Typically, acknowledgements are grouped and processed in batch mode
- $\Rightarrow$  Requires still unbounded messages sizes



## Causal Broadcast (RCO): Algorithm 2 [\[1\]](#page-57-1)

```
State:
  pending //set of messages that cannot be delivered yet
  VC // vector clock
Upon Init do:
  pending <- ∅
  forall p_i \in \Pi do: \nabla C[p_i] \leftarrow 0Upon rco-broadcast(m) do
  trigger rco-deliver(self, m)
  trigger rb-broadcast(VC, m)
  VC[self] <- VC[self] + 1
Upon rb-deliver(pk, VCm, m) do
  if ( p_k \neq self ) then
    pending <- pending ∪ {(pk, VCm, m)}
    while exists (q, VC_{m_q}, m_q) \in pending with VC \geq VC_{m_q} do
         pending \leq pending \ {(q, VC<sub>m<sub>a</sub>, m<sub>q</sub>)}</sub>
         trigger rco-Deliver(q, mq)
         VC[q] <- VC[q] + 1
```


## Limitations of Causal Broadcast

Example: Replicated database handling bank accounts

- Initially, account A holds 1000 Euro.
- User deposits 150 Euro, triggers broadcast of message  $m_1 =$  'add 150 Euro to A'
- Concurrently, bank initiates broadcast of message

```
m_2 = 'add 2% interest to A'
```
Diverging state because processes can observe messages in different order





## Outlook: Total-order broadcast (aka Atomic Broadcast)

- **All processes deliver their messages in the same order**
- Replicated services
	- **Multiple processes execute the same sequence of commands**
	- Replicated State Machines (RSM)
- **Impossibile under our assumed system model**



## Summary

- Composability of distributed algorithms
- Correctness proofs based on properties of underlying level  $+$ algorithmic properties
- **Different variants of solution to the Broadcast Problem** 
	- **Best-effort broadcast** 
		- Reliable only if sender is correct
	- Reliable broadcast
		- Reliable independent of whether sender is correct
	- Uniform reliable broadcast
		- Considers also behavior of failed nodes
	- FIFO broadcast
		- Reliable broadcast with FIFO delivery order
	- **Causal broadcast** 
		- Reliable broadcast with causal delivery order
	- **Total-order broadcast** 
		- Reliable and same order of delivery at all nodes

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## Further reading I

<span id="page-57-1"></span>I1 Michel Raynal, André Schiper und Sam Toueg. "The Causal<br>Cedesing Abstraction and a Simple Way to Implement it", la Ordering Abstraction and a Simple Way to Implement it". In: Inf. Process. Lett. 39.6 (1991), S. 343-350. DOI: [10.1016/0020-0190\(91\)90008-6.](https://doi.org/10.1016/0020-0190(91)90008-6) url: [https://doi.org/10.1016/0020-0190\(91\)90008-6.](https://doi.org/10.1016/0020-0190(91)90008-6)