

# High Availability under Eventual Consistency

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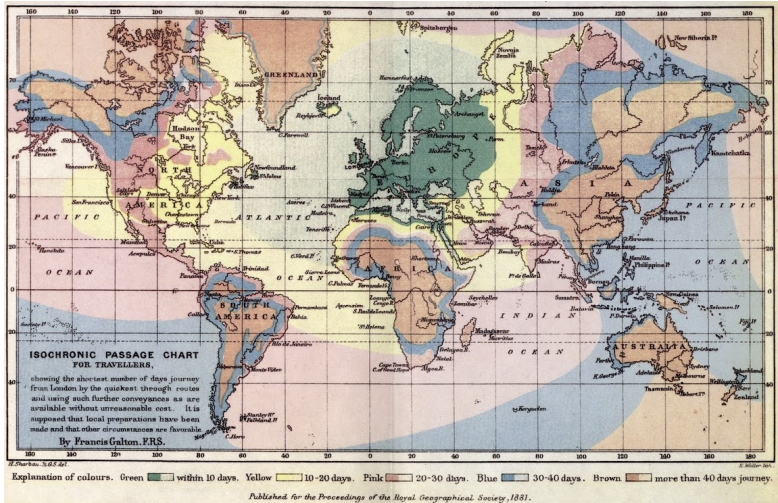
Shonan PL4DS Meeting 2019

# The speed of communication in the 19th century

## Francis Galton Isochronic Map

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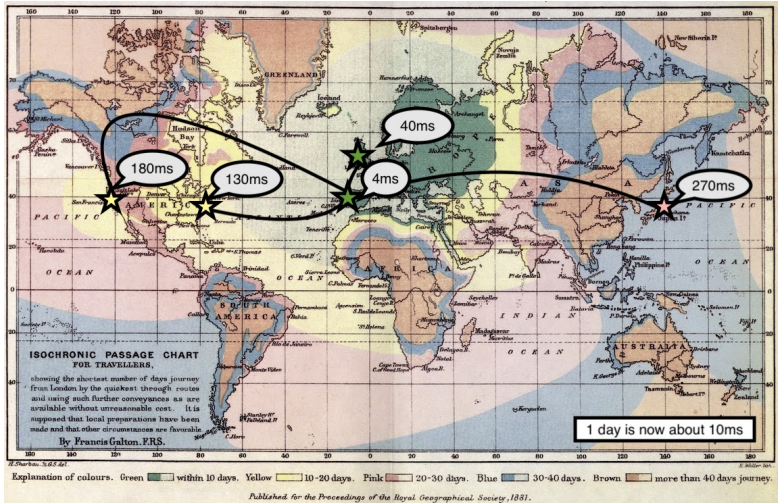


# The speed of communication in the 21st century

RTT data gathered via <http://www.azurespeed.com>

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# The speed of communication in the 21st century

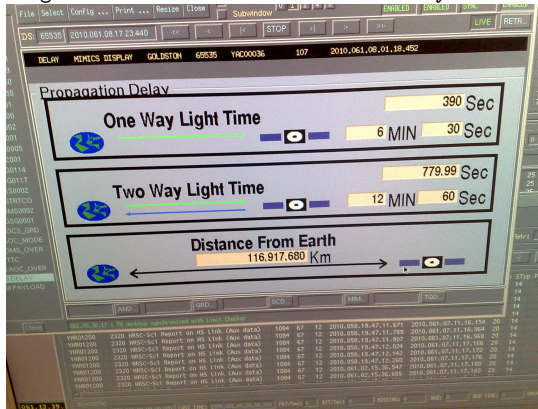
If you really like high latencies ...

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## Time delay between Mars and Earth

[blogs.esa.int/mex/2012/08/05/time-delay-between-mars-and-earth/](http://blogs.esa.int/mex/2012/08/05/time-delay-between-mars-and-earth/)



## Delay/Disruption Tolerant Networking

[www.nasa.gov/content/dtn](http://www.nasa.gov/content/dtn)

# Latency magnitudes

## Geo-replication

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- $\lambda$ , up to 50ms (local region DC)
- $\Lambda$ , between 100ms and 300ms (inter-continental)

### No inter-DC replication

Client writes observe  $\lambda$  latency

### Planet-wide geo-replication

Replication techniques versus client side write latency ranges

Consensus/Paxos [ $\Lambda$ ,  $2\Lambda$ ] (with no divergence)

Primary-Backup [ $\lambda$ ,  $\Lambda$ ] (asynchronous/lazy)

Multi-Master  $\lambda$  (allowing divergence)

Multi-Master executions maximize availability and response speeds

# From sequential to concurrent executions

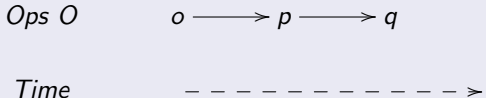
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Consensus provides illusion of a single replica

This also preserves (slow) sequential behaviour

## Sequential execution



We have an ordered set  $(O, <)$ .  $O = \{o, p, q\}$  and  $o < p < q$

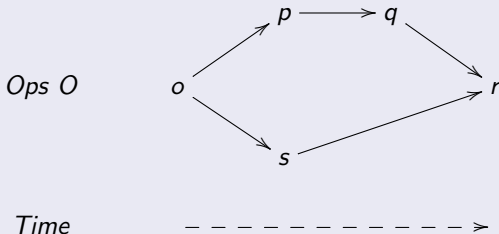
# From sequential to concurrent executions

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Multi-master can expose concurrency

## Concurrent execution



Partially ordered set  $(O, \prec)$ .  $o \prec p \prec q \prec r$  and  $o \prec s \prec r$   
Some ops in  $O$  are concurrent:  $p \parallel s$  and  $q \parallel s$

# Conflict-Free Replicated Data Types (CRDTs)

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- Convergence after concurrent updates. Favor AP under CAP
- Examples include counters, sets, mv-registers, maps, graphs
- Operation based CRDTs. Operation effects must commute
- State based CRDTs are rooted on join semi-lattices



# Design of Conflict-Free Replicated Data Types

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A partially ordered log (polog) of operations implements any CRDT

Replicas keep increasing local views of an evolving distributed polog

Any query, at replica  $i$ , can be expressed from local polog  $O_i$

Example: Counter at  $i$  is  $|\{\text{inc} \mid \text{inc} \in O_i\}| - |\{\text{dec} \mid \text{dec} \in O_i\}|$

CRDTs are efficient representations following some **design principles**

# Principle of permutation equivalence

E.g. Counters

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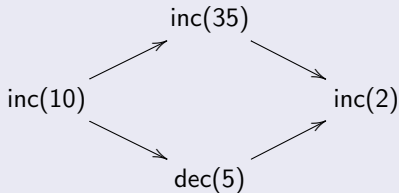
If operations in sequence can commute, preserving a given result, then under concurrency they should preserve the same result

## Sequential

$\text{inc}(10) \longrightarrow \text{inc}(35) \longrightarrow \text{dec}(5) \longrightarrow \text{inc}(2)$

$\text{dec}(5) \longrightarrow \text{inc}(2) \longrightarrow \text{inc}(10) \longrightarrow \text{inc}(35)$

## Concurrent



You guessed: Result is 42

# Registers

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Registers are an ordered set of write operations

## Sequential execution

$A \quad \text{wr}(x) \longrightarrow \text{wr}(j) \longrightarrow \text{wr}(k) \longrightarrow \text{wr}(x)$

## Sequential execution under distribution

$A \quad \text{wr}(x)$

$B \quad \text{wr}(j) \longrightarrow \text{wr}(k)$

$\text{wr}(x)$

Register value is  $x$ , the last written value

# Implementing Registers

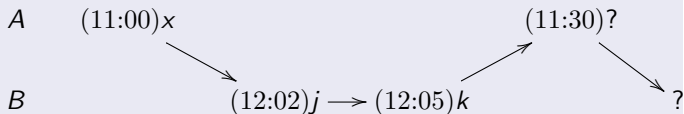
*Naïve Last-Writer-Wins*

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CRDT register implemented by attaching local wall-clock times

Sequential execution under distribution



Problem: Wall-clock on B is one hour ahead of A

Value  $x$  might not be writeable again at A since  $12:05 > 11:30$

# Registers

## Sequential Semantics

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Register shows value  $v$  at replica  $i$  iff

$$wr(v) \in O_i$$

and

$$\nexists wr(v') \in O_i \cdot wr(v) < wr(v')$$

# Preservation of sequential semantics

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Concurrent semantics should preserve the sequential semantics

This also ensures correct sequential execution under distribution

# Multi-value Registers

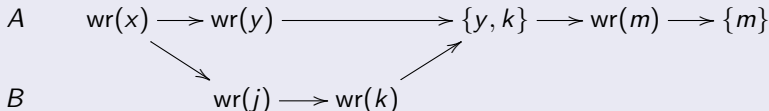
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Concurrency semantics shows all concurrent values

$$\{v \mid \text{wr}(v) \in O_i \wedge \nexists \text{wr}(v') \in O_i \cdot \text{wr}(v) \prec \text{wr}(v')\}$$

## Concurrent execution



Dynamo shopping carts are multi-value registers with payload sets

The  $m$  value could be an application level merge of values  $y$  and  $k$

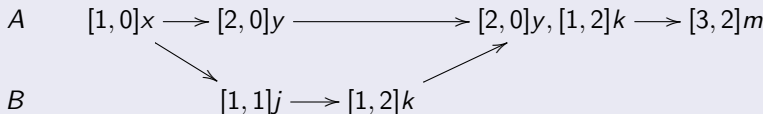
# Implementing Multi-value Registers

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Concurrency can be precisely tracked with version vectors

## Concurrent execution (version vectors)



Metadata can be compressed with a common causal context and a single scalar per value (dotted version vectors)



# Sets

## Sequential Semantics

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Consider add and rmv operations

$X = \{\dots\}$ ,  $\text{add}(a) \longrightarrow \text{add}(c)$  we observe that  $a, c \in X$

$X = \{\dots\}$ ,  $\text{add}(c) \longrightarrow \text{rmv}(c)$  we observe that  $c \notin X$

In general, given  $O_i$ , the set has elements

$$\{e \mid \text{add}(e) \in O_i \wedge \nexists \text{rmv}(e) \in O_i \cdot \text{add}(e) < \text{rmv}(e)\}$$

# Sets

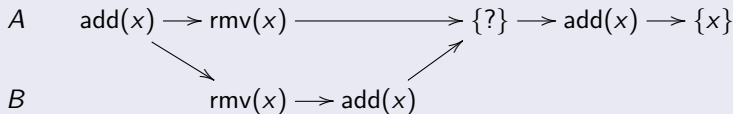
## Concurrency Semantics

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Problem: Concurrently adding and removing the same element

### Concurrent execution



# Concurrency Semantics

## Add-Wins Sets

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Let's choose Add-Wins

Consider a set of known operations  $O_i$ , at node  $i$ , that is ordered by an *happens-before* partial order  $\prec$ . Set has elements

$$\{e \mid \text{add}(e) \in O_i \wedge \nexists \text{rmv}(e) \in O_i \cdot \text{add}(e) \prec \text{rmv}(e)\}$$

# Concurrency Semantics

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Is this familiar?

# Concurrency Semantics

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Is this familiar?

The sequential semantics applies identical rules on a total order

# Concurrency Semantics

## Add-Wins Sets

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Is this familiar?

The sequential semantics applies identical rules on a total order

$$\{e \mid \text{add}(e) \in O_i \wedge \nexists \text{rmv}(e) \in O_i \cdot \text{add}(e) < \text{rmv}(e)\}$$

# Equivalence to a sequential execution?

## Add-Wins Sets

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Can we always explain a concurrent execution by a sequential one?

### Concurrent execution

A      $\{x, y\} \rightarrow \text{add}(y) \rightarrow \text{rmv}(x) \rightarrow \{y\} \rightarrow \{x, y\}$

B      $\{x, y\} \rightarrow \text{add}(x) \rightarrow \text{rmv}(y) \rightarrow \{x\} \rightarrow \{x, y\}$



### Two (failed) sequential explanations

H1      $\{x, y\} \rightarrow \dots \rightarrow \text{rmv}(x) \rightarrow \{\cancel{x}, y\}$

H2      $\{x, y\} \rightarrow \dots \rightarrow \text{rmv}(y) \rightarrow \{x, \cancel{y}\}$

Concurrent executions can have richer outcomes

# Concurrency Semantics

## Remove-Wins Sets

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Alternative: Let's choose Remove-Wins

$$X_i \doteq \{e \mid \text{add}(e) \in O_i \wedge \forall \text{rmv}(e) \in O_i \cdot \text{rmv}(e) \prec \text{add}(e)\}$$



# Concurrency Semantics

## Remove-Wins Sets

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Alternative: Let's choose Remove-Wins

$$X_i \doteq \{e \mid \text{add}(e) \in O_i \wedge \forall \text{rmv}(e) \in O_i \cdot \text{rmv}(e) \prec \text{add}(e)\}$$

Remove-Wins requires more metadata than Add-Wins

Both Add and Remove-Wins have same semantics in a total order

They are different but both preserve sequential semantics

# Reference

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Conflict-Free Replicated Data Types CRDTs.  
Encyclopedia of Big Data Technologies, 2019.  
Nuno M. Preguiça, Carlos Baquero, Marc Shapiro.

# Open Questions

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- Given operations and queries can CRDTs be synthesized?
- Stateful (dis)order tolerant communication protocols
- Integrity guaranties and privacy in data evolution