# Across Time and Space A Many-Worlds Interpretation of State

Göbel Sandstede bobkonf 19

#### Let's Talk About Time

- Edit History, Undo / Redo
- Multi-user Collaboration
- Heterogeneous Data Sources (sensors!)
- Speculative Transactions ("what-if?")
- Conflict Resolution

#### Let's Talk About Time

How can we...

- (1) ...model different time semantics?
- (2) ...implement those efficiently?

#### Disclaimer

Talk Focus

Stream Processing

Frontend State Management

Data Modeling

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stealing ideas from

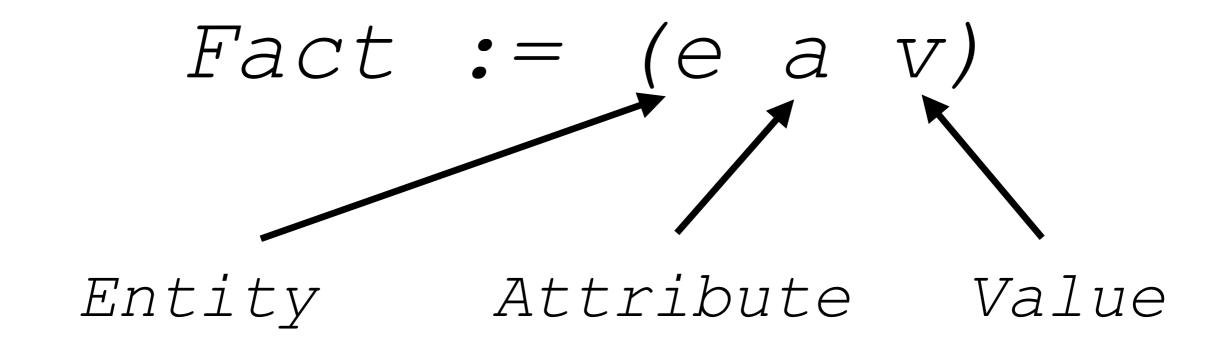
Frank McSherry (ETH)







# Definitions



Person X

:age

23

TODO Y

:done?

True

Account Z

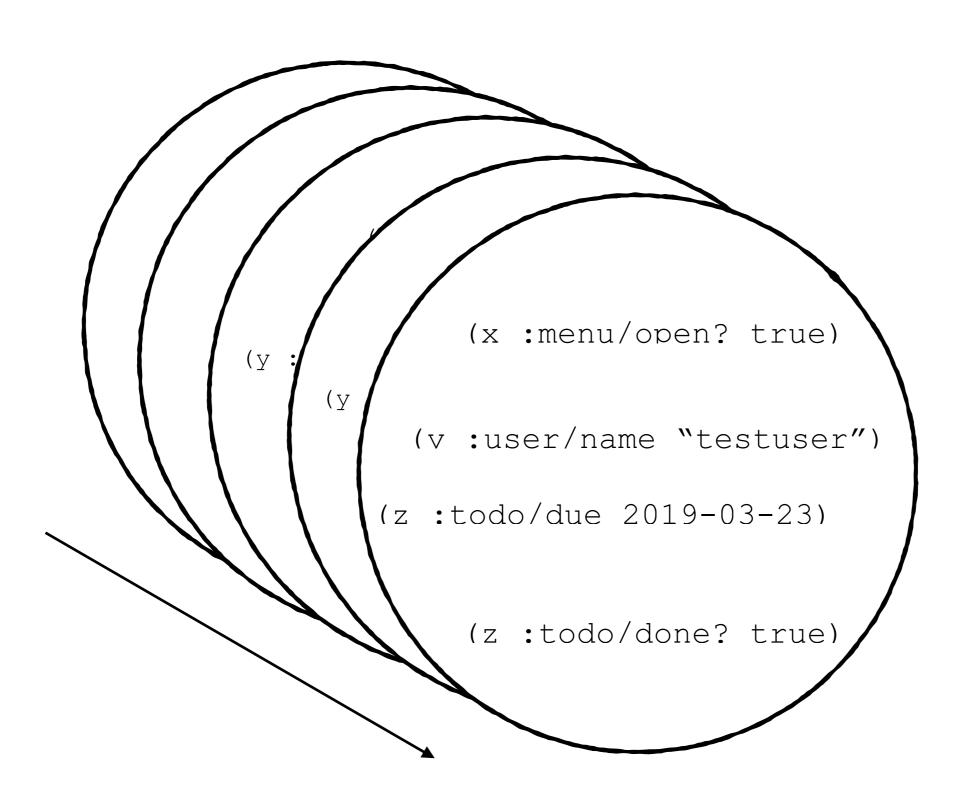
:owner

Person X

#### State := Set of Facts

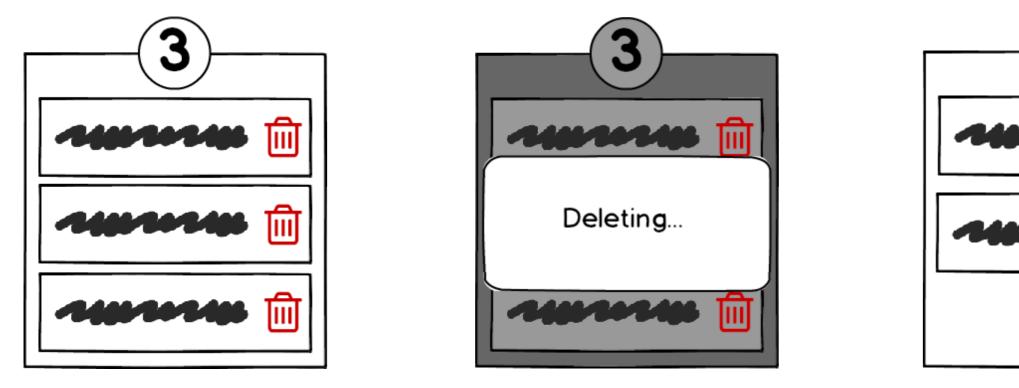
```
(x :menu/open? true)
(y :user/name "testuser")
       (z :todo/due 2019-03-23)
          (z :todo/done? true)
```

#### Time := An Order on States



(I)

No Time, Only Space

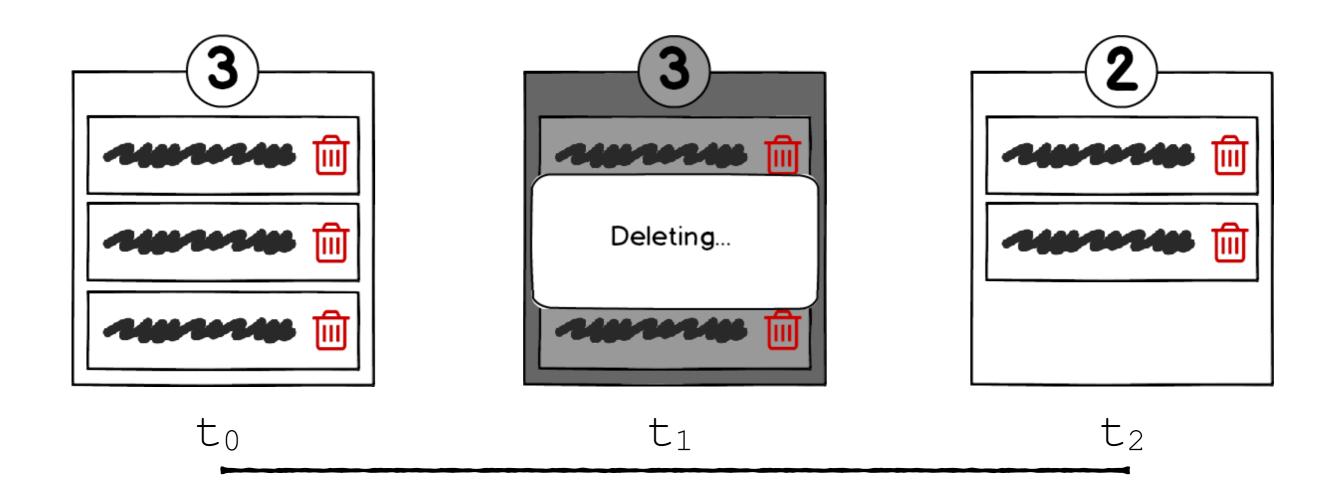


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- Wild West: Every component for themselves
- State stored directly in DOM
- No single source of truth ("DB"), but roughly { (e a v), ...}

(II)

Epochal Snapshots



- World as a flip book: Redux, Datomic, ...
- Transactions: DB -> Tx -> DB
- DB := { (e a v  $\underline{t}$ ), ...}

# Snapshot

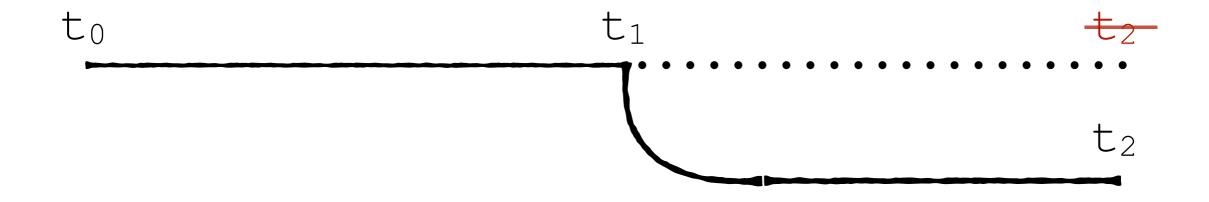
$$DB_{t^*} = \sum_{\{(e \ a \ v \ t) \mid t \le t^*\}}$$

"happened before"

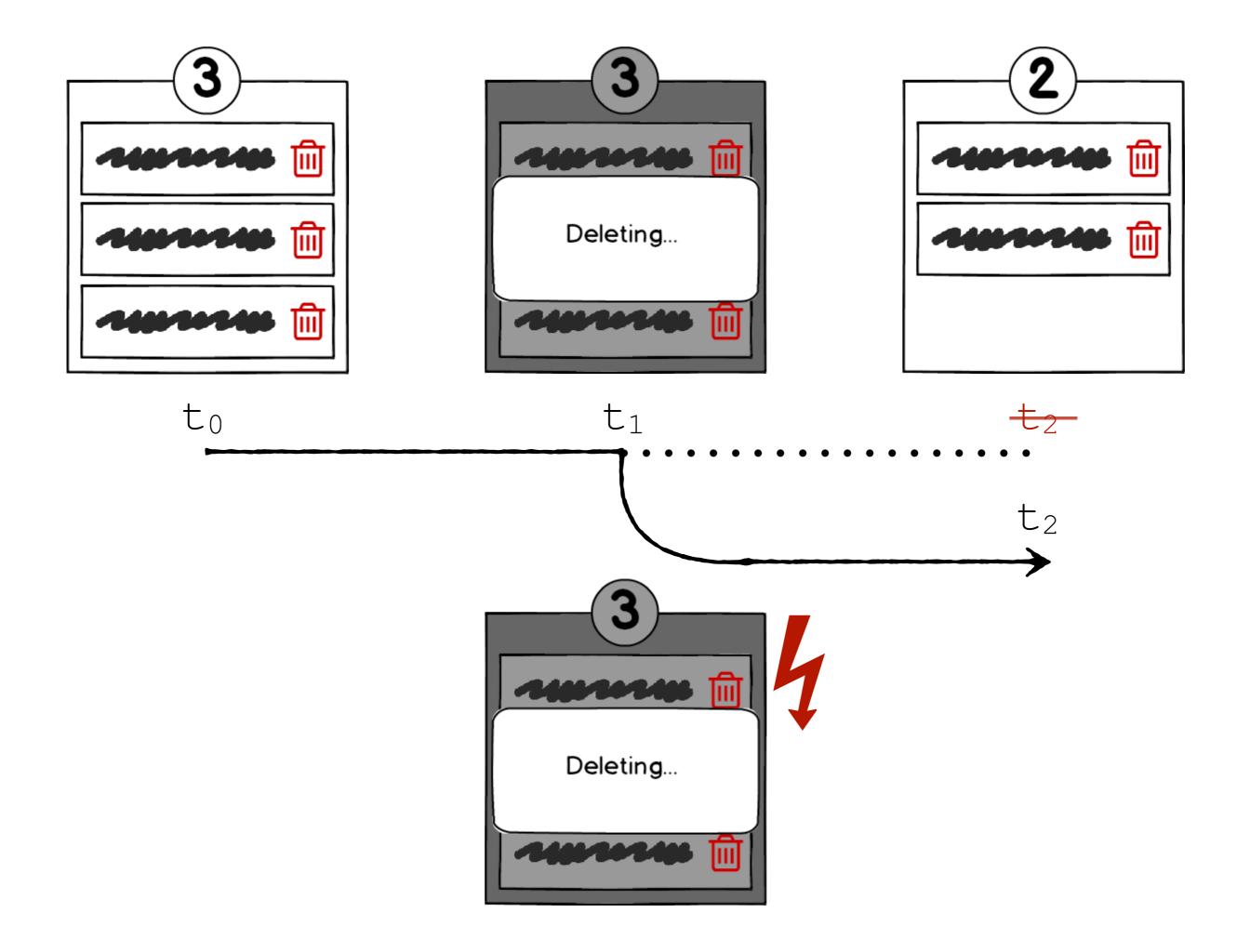
No Retractions (for now)

#### Time Travel

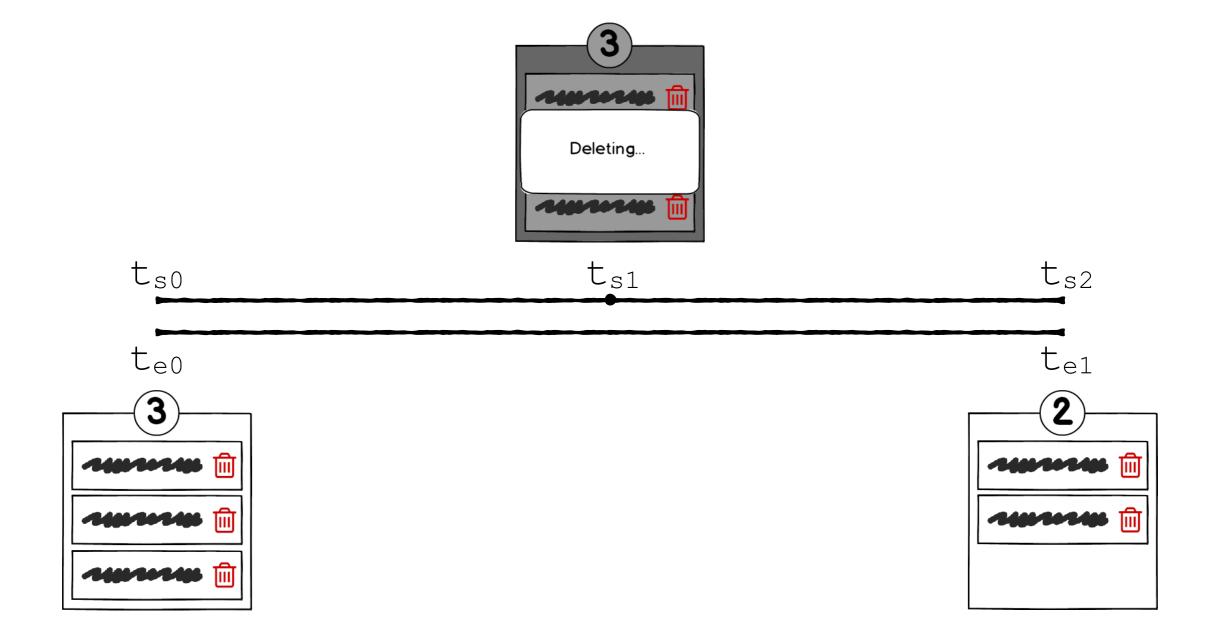
Scrubbing through Snapshots



- Applications: undo / redo
- Destructive writes (single timeline)
- <u>But</u>: All-or-nothing problem



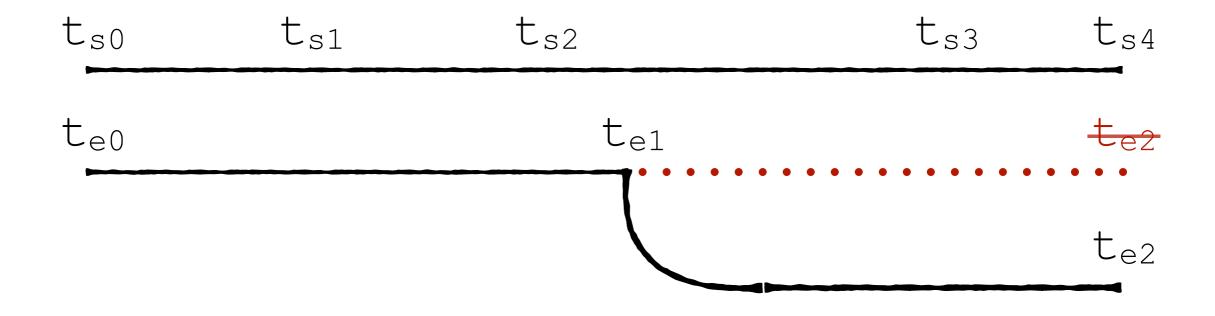
```
(III)
Bitemporal Snapshots
```



- 2 Timelines: t<sub>system</sub>, t<sub>event</sub>
- System progress independent of domain
- DB := { (e a v  $(t_{system}, t_{event})$ ), ...}

#### Time Travel II

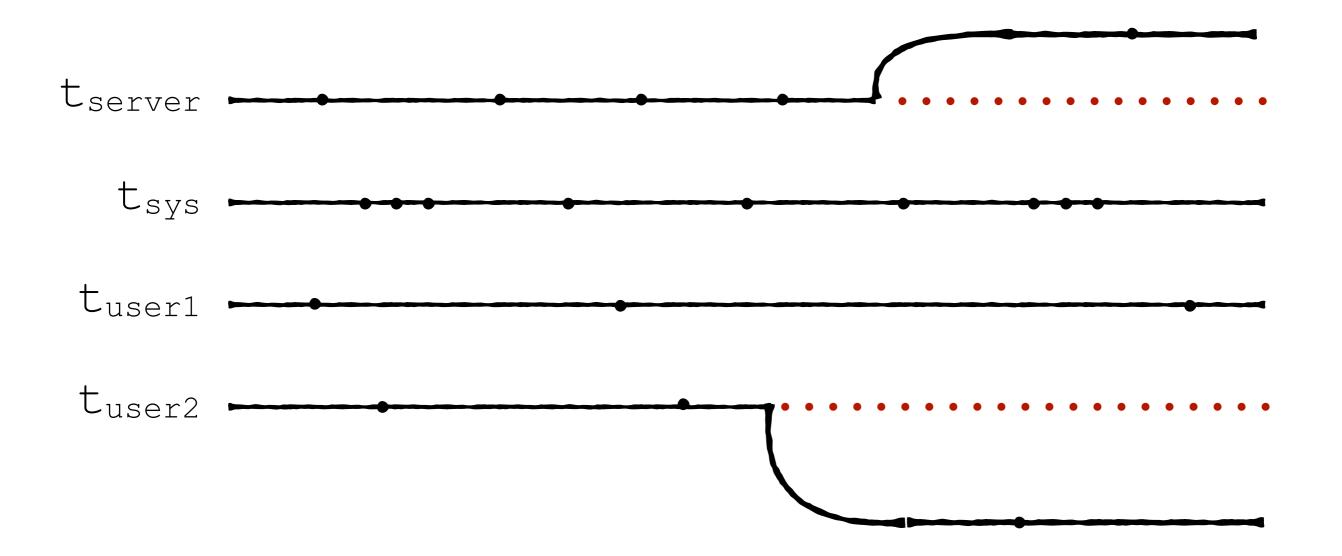
Solving the All-or-nothing problem



- Scrubbing along t<sub>event</sub>, UI along t<sub>system</sub>
- Destructive writes (per timeline)
- All-or-nothing problem solved!

(IV)

Multitemporal Snapshots



- Bitemporal snapshots separate system events from user actions
- Multitemporal snapshots separate *n* sources
- DB := { (e a v (t<sub>server</sub>, t<sub>sys</sub>, t<sub>user1</sub>, t<sub>user2</sub>, ...) ), ...}

(and some orders)

$$DB_{\star} = \sum_{\{(e \ a \ v \cdot) \mid \cdot \leq \star\}} \{(e \ a \ v \cdot) \mid \cdot \leq \star\}$$

$$(I) \quad (II) \quad (III) \quad (IV) \quad (t_{system}, t_{event}) \quad (t_{server}, t_{sys}, t_{user1}, t_{user2}, \ldots)$$

(and some orders)

$$DB_{\star} = \begin{cases} (e \ a \ v \cdot) \mid \cdot \leq \star \end{cases}$$

$$(I) \quad (II) \quad (III) \quad (IV)$$

$$- \quad t \quad (t_{system}, t_{event}) \quad (t_{server}, t_{sys}, t_{user1}, t_{user2}, \ldots)$$

$$\uparrow \quad totally \quad partially$$

ordered

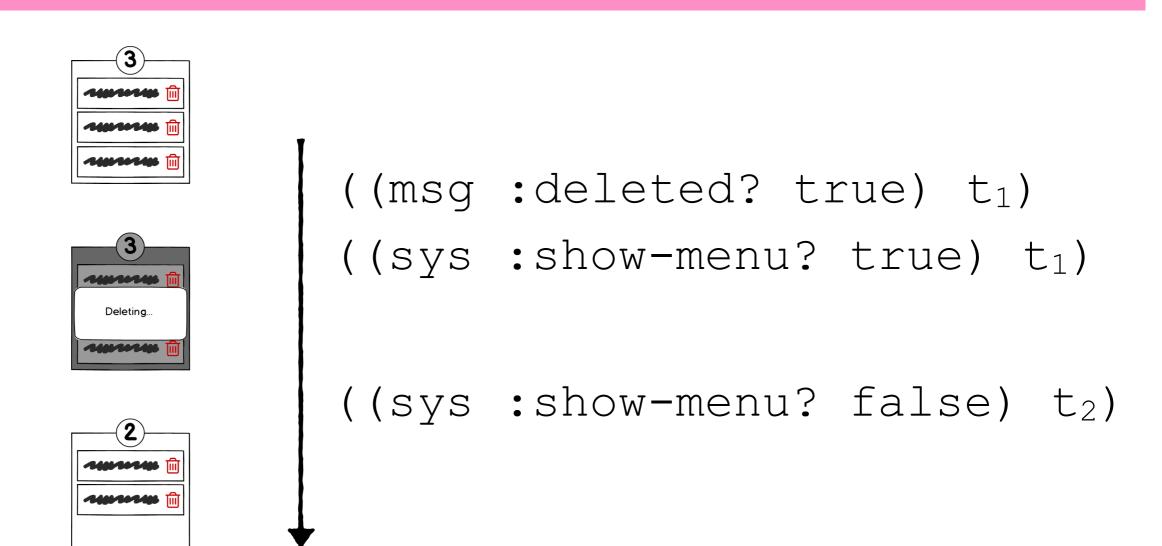
ordered

(and some total orders)

"happened before"

	0	1	2
0			
1			
2			

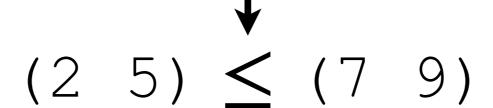
(and some total orders)



Total order coalesces event sources.

(and some **product partial** orders)

"happened before"



$$(2 5) \leq (3 5)$$

(and some product partial orders)

"happened before"

 $(2 \ 5) \le (7 \ 9)$ 

 $(2 \ 5) \le (3 \ 5)$ 

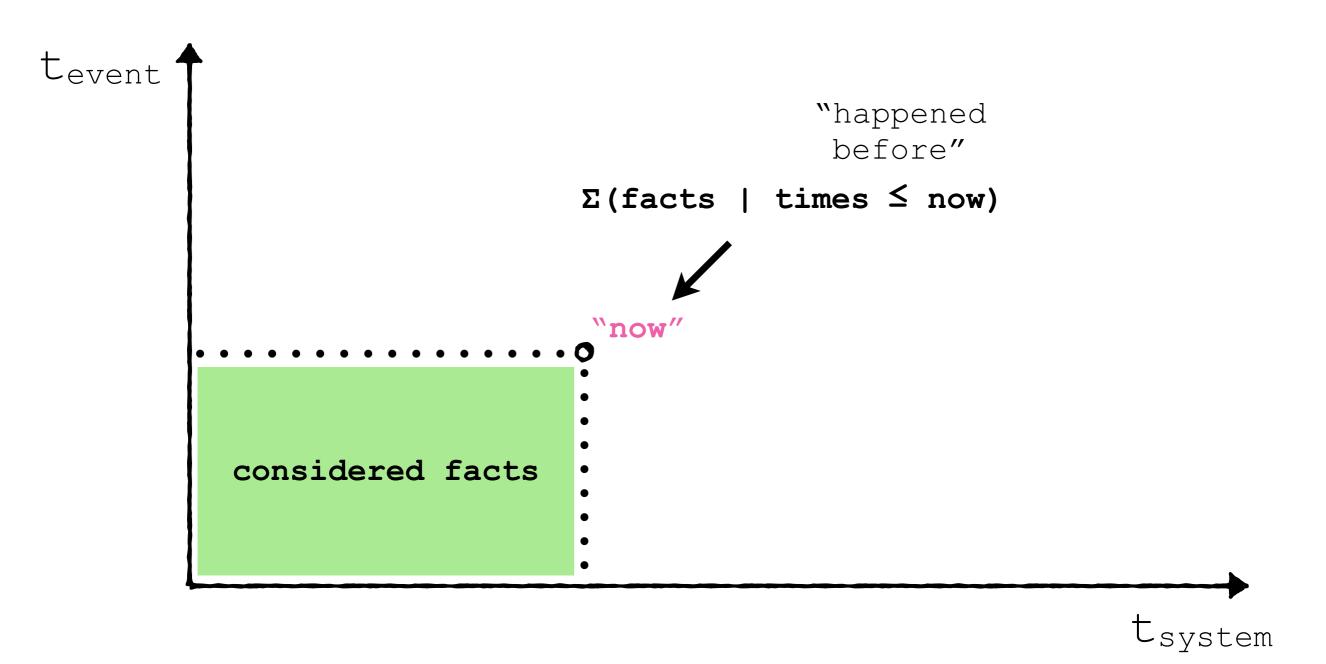
 $(2 \ 5) \nleq (1 \ 9)$ 

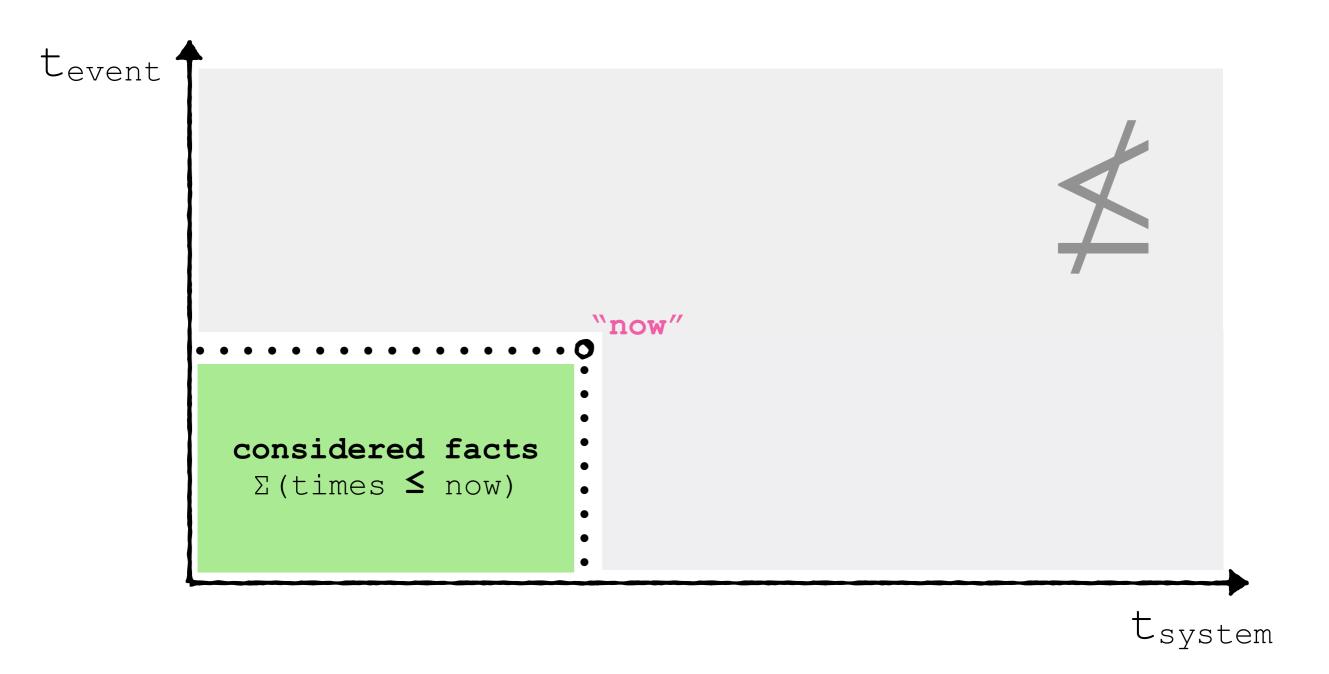
(1 9) **≰** (2 5)

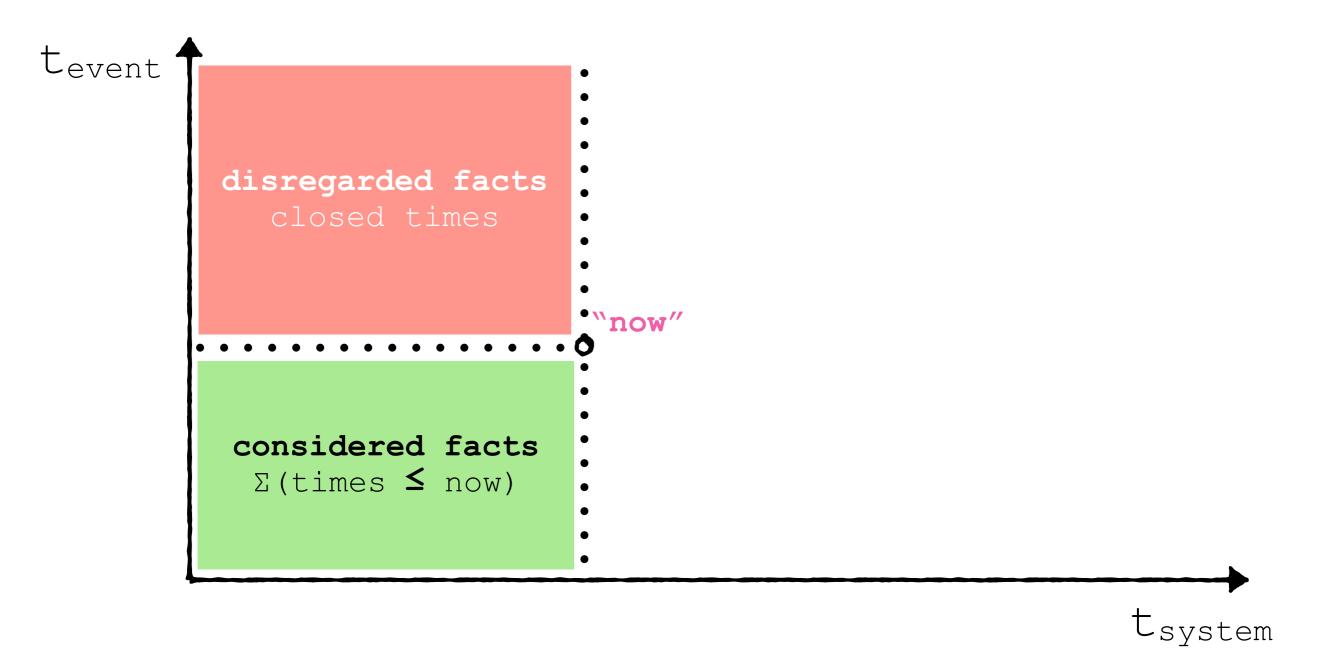
no order!

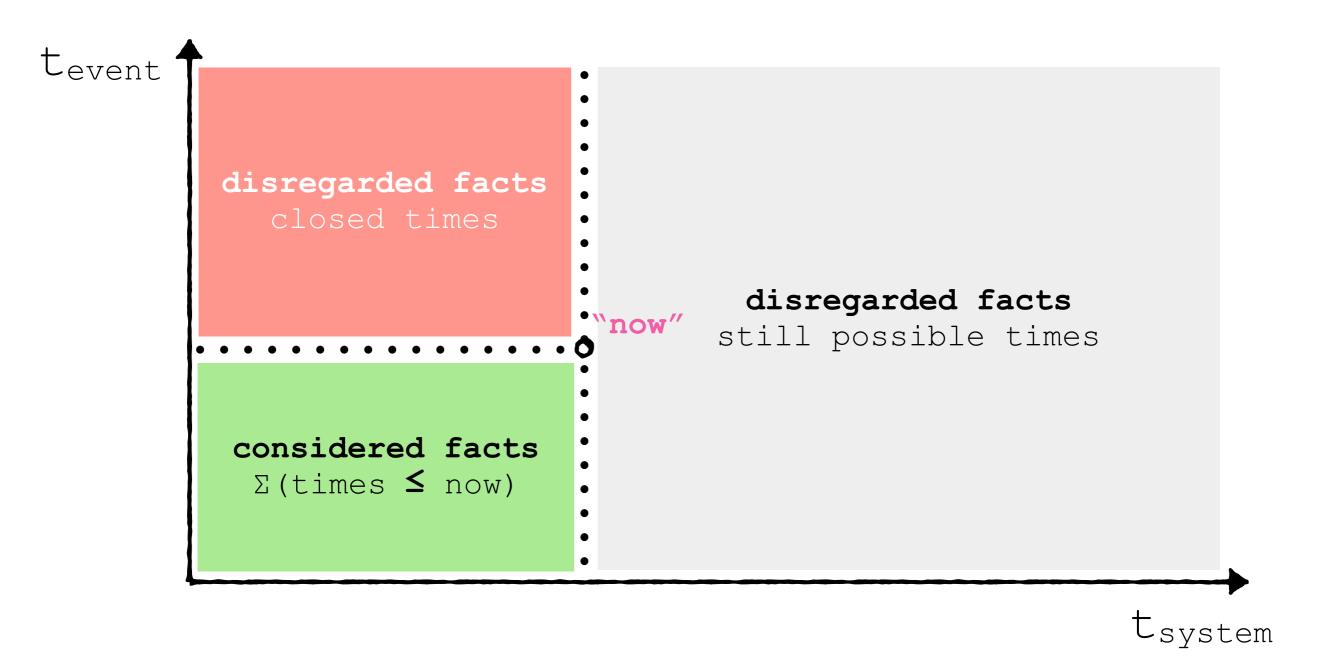
(and some product partial orders)

"happened before"  $(2 \ 5) \le (7 \ 9)$ (2 5) < (3 5) $(2 \ 5) \nleq (1 \ 9)$ no order!  $(1 \ 9) \nleq (2 \ 5)$  $(1000\ 0) \nleq (0\ 1)$ 

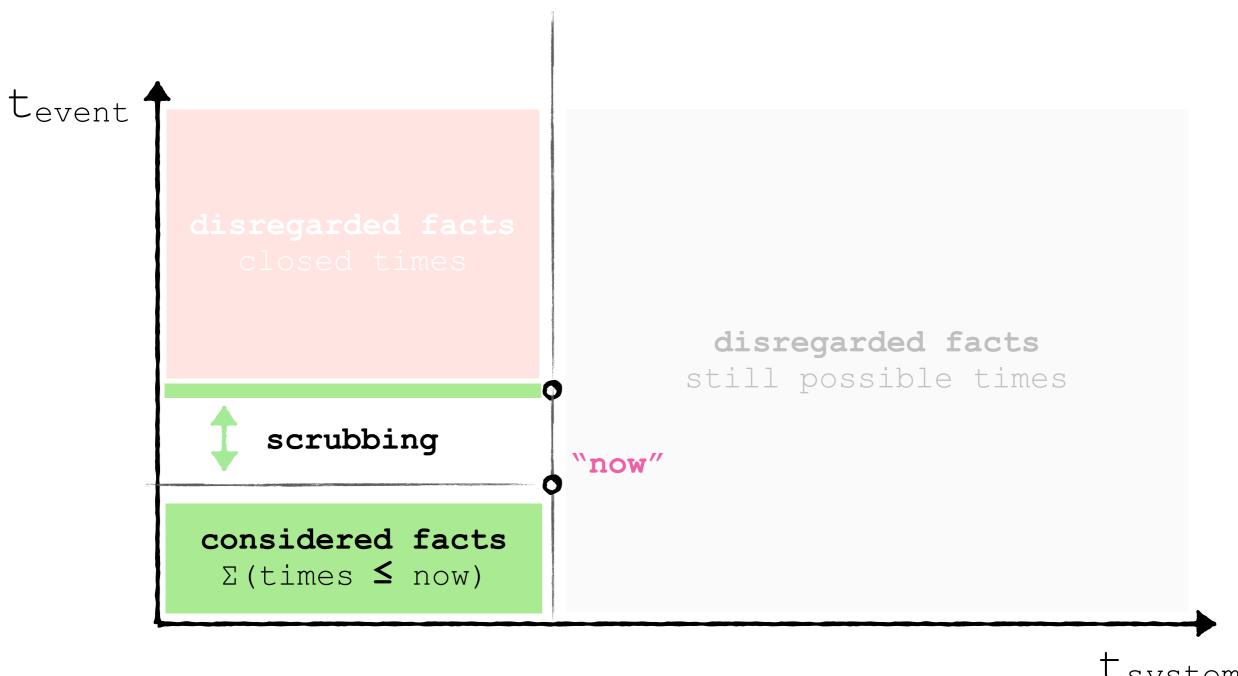




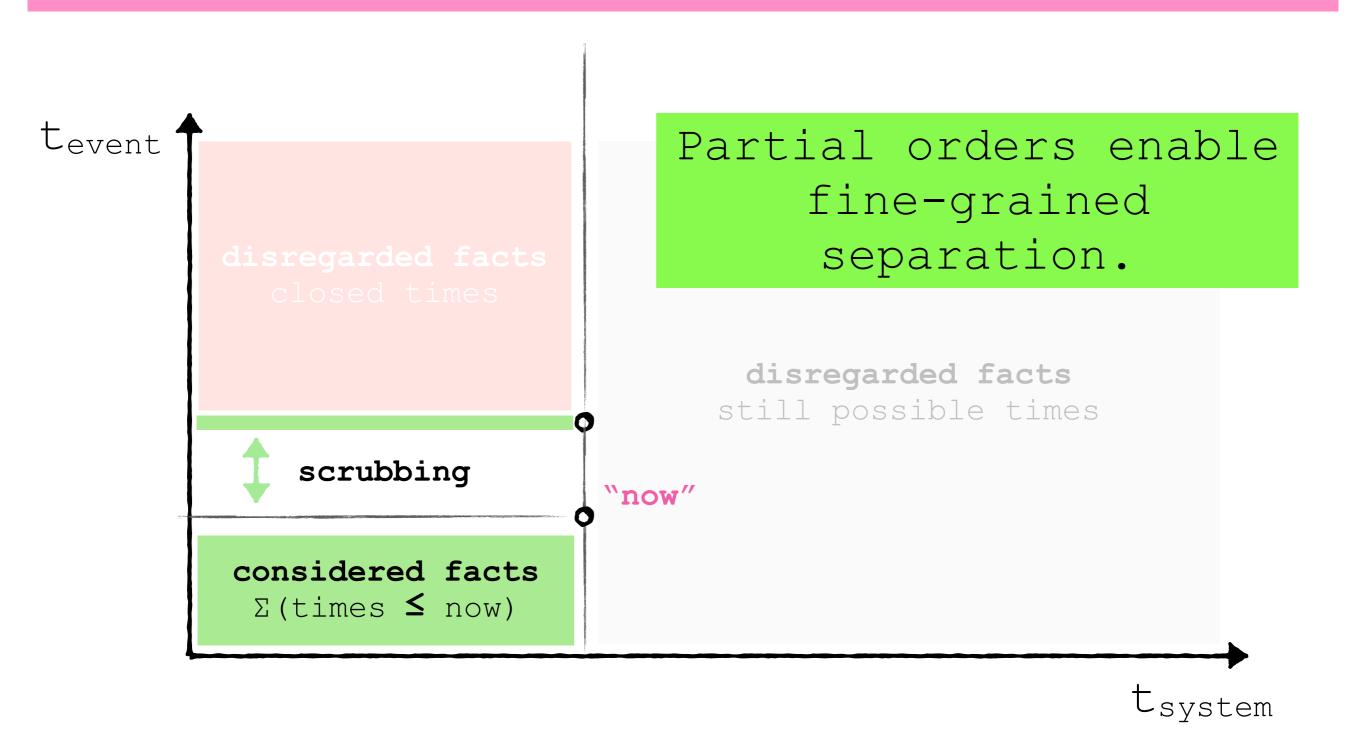


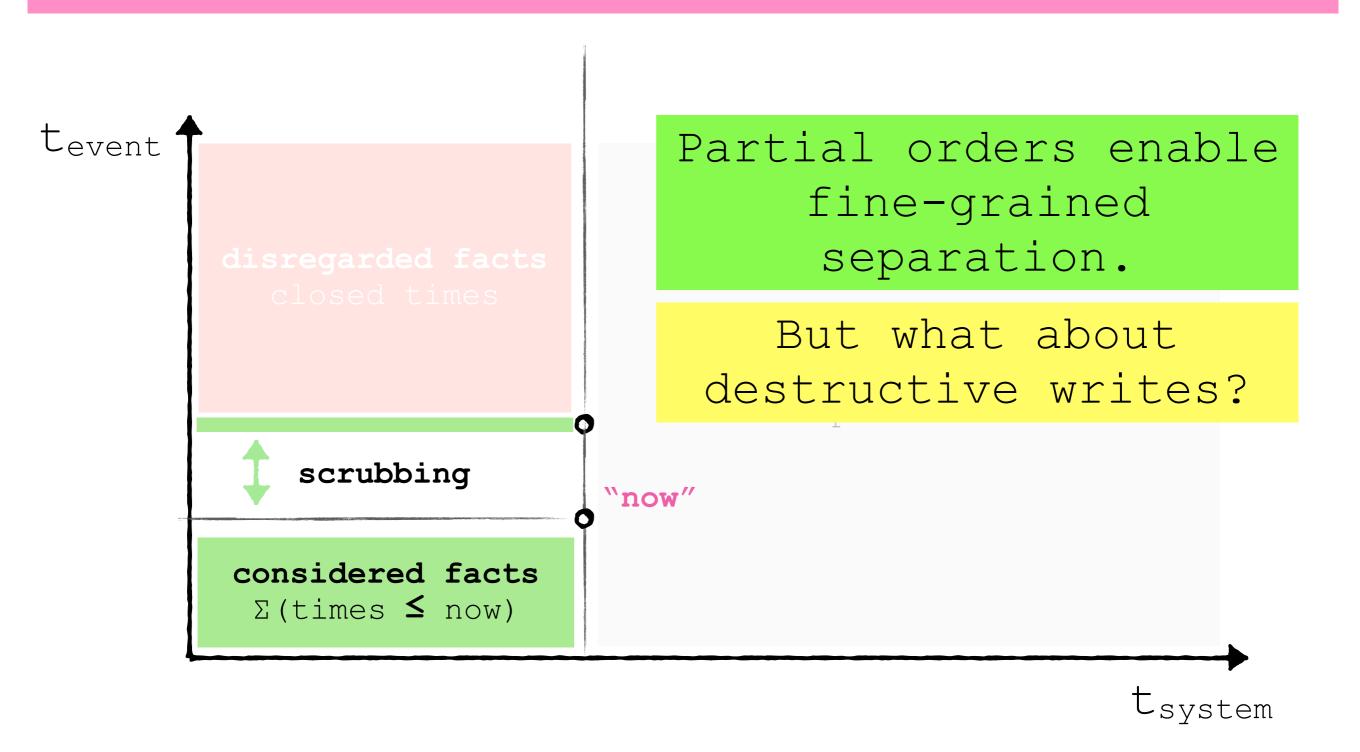


(and some product partial orders)



tsystem





#### Non-destructive Writes

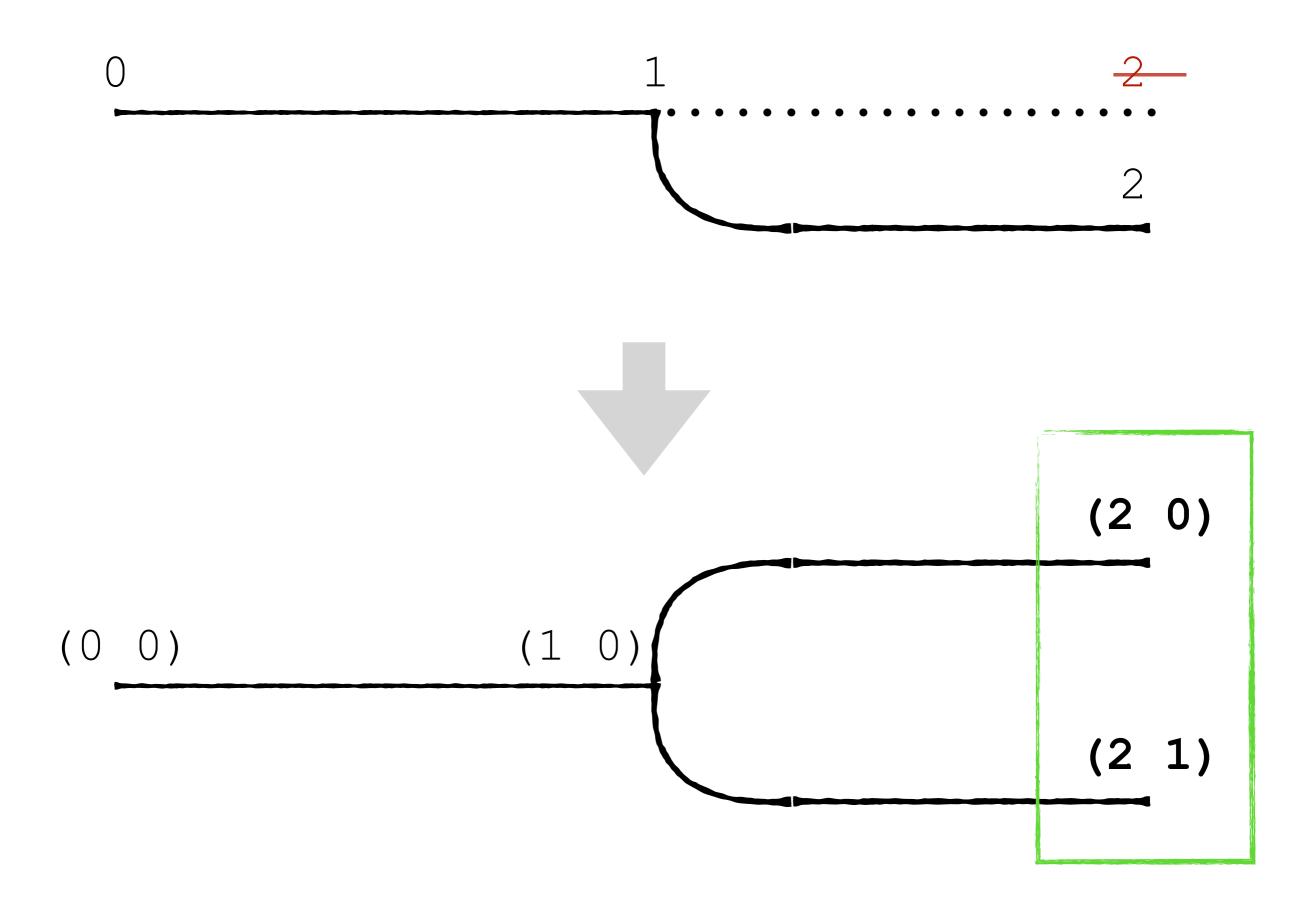
Why bother?

The pasts, the presents, the futures!

- Simulations & what-if
- Collaboration (conflicting edits)
- Functional becomes logic programming

 $(\vee)$ 

### N-DIMENSIONALL

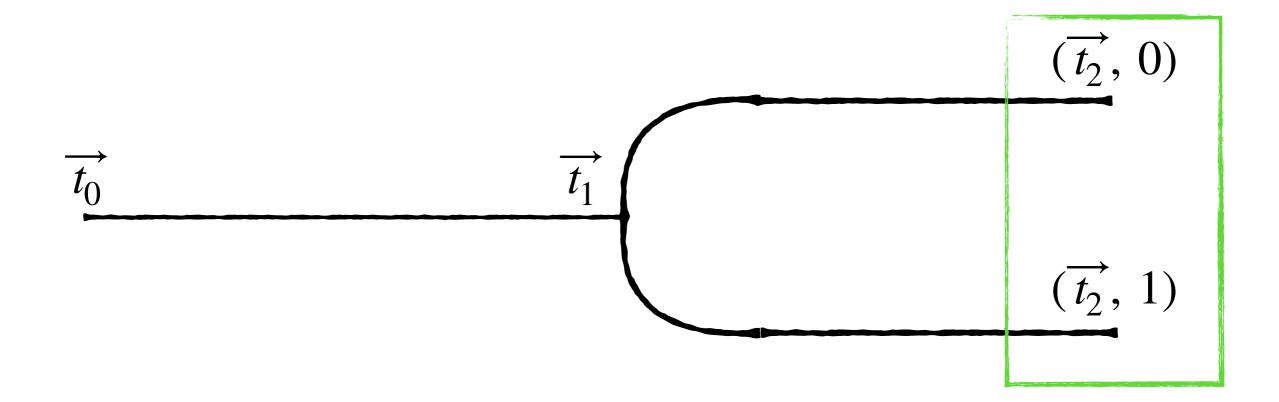


### Why Not?

(2 0) "happened-before" (2 1)



- Versions should be isolated...
- ...but version (2 1) can see version (2 0)
- Reality is leaking!



- Parallel, isolated universes
- $\bullet$  DB -> Tx -> DB becomes DB -> Tx -> [DB]
- DB := { (e a v (( $t_{sys}$ ,  $t_{user1}$ ,...),  $\eta$ )), ...}

### A New Order

### bi-temporal

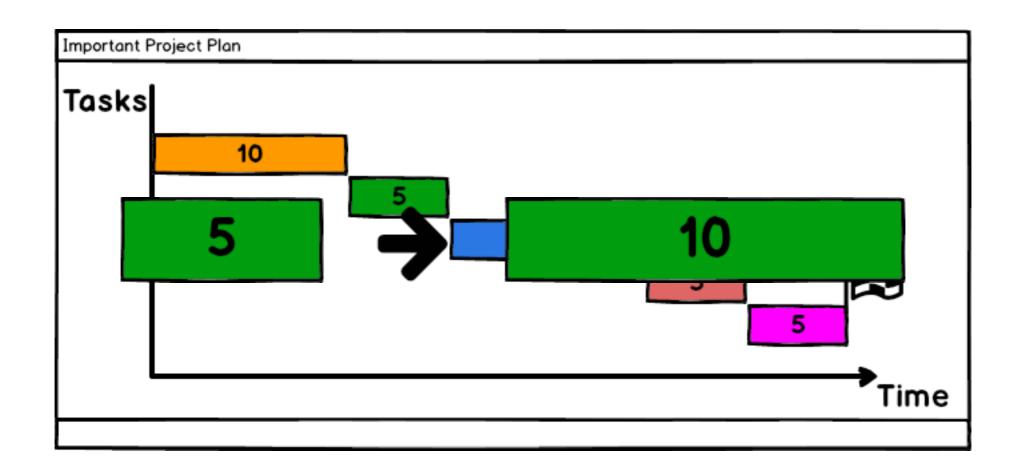
(a,b) happened-before (c,d)

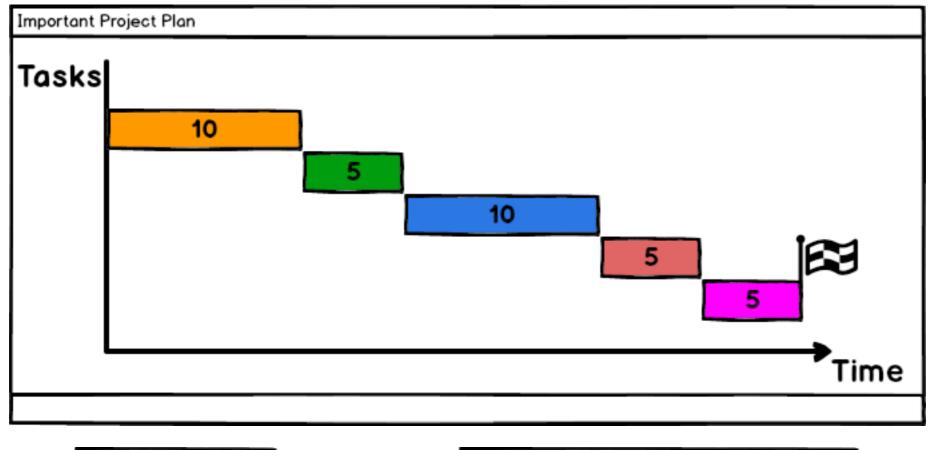
$$\Leftrightarrow$$
  $(a \le c) \land (b \le d)$ 

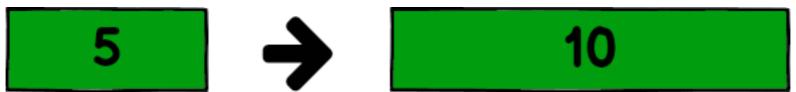
#### bi-dimensional

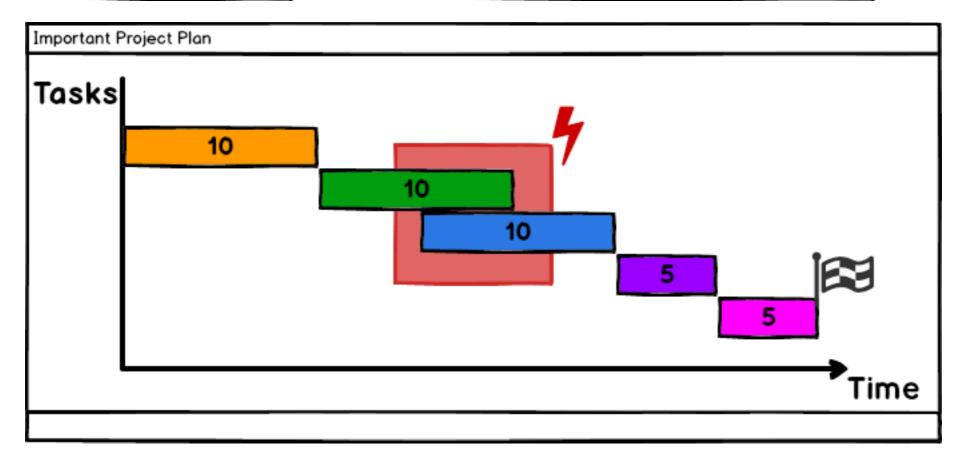
 $((a,b),\eta_1)$  happened-before  $((c,d),\eta_2)$ 

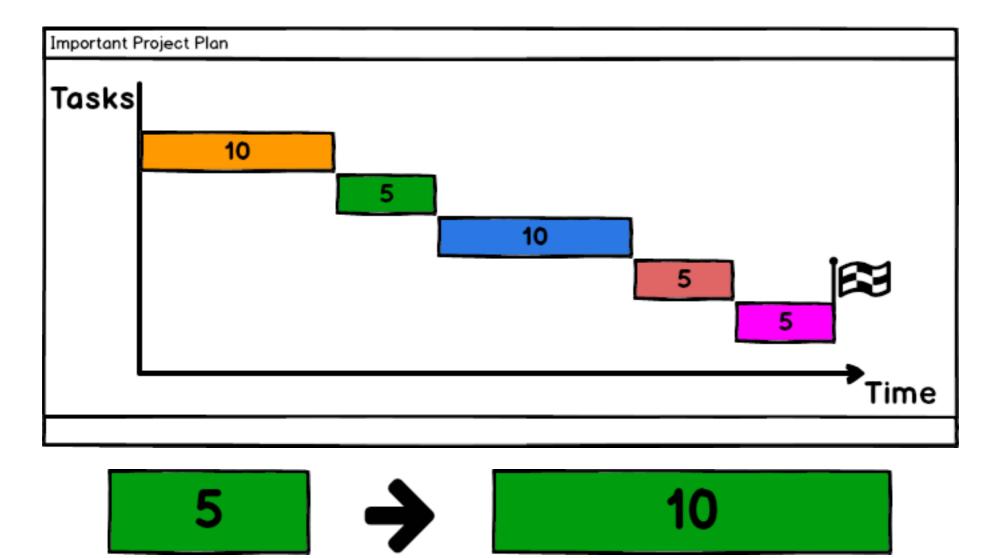
$$\Leftrightarrow$$
  $(a \le c) \land (b \le d) \land (\eta_1 = \eta_2)$ 

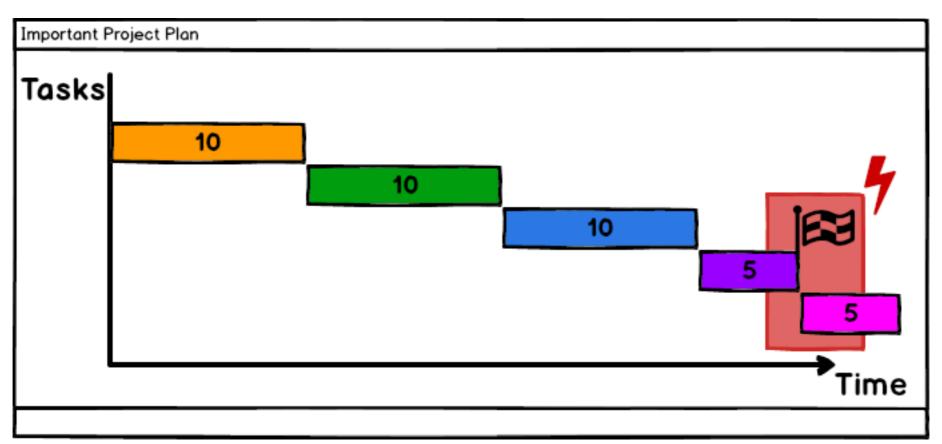


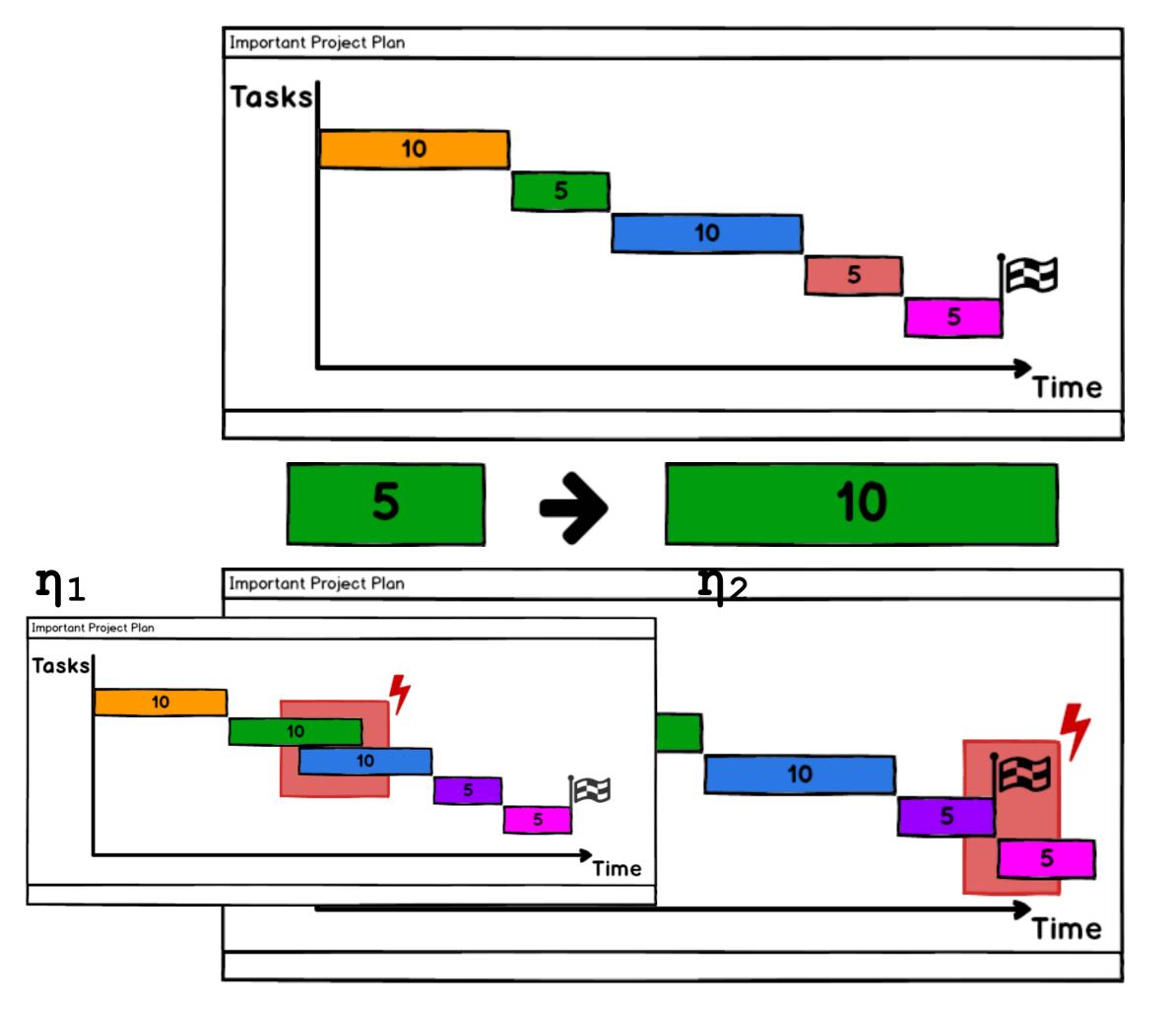












```
(VI)
Differential Programming
```

### Implementation Challenges?

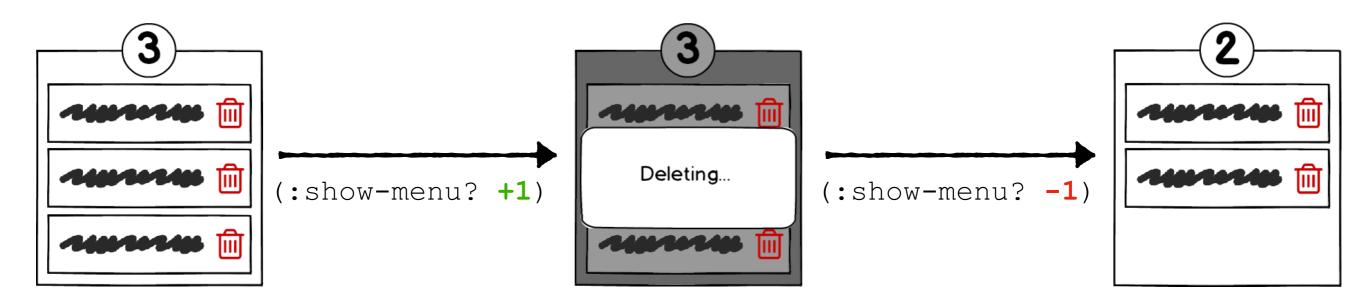
- (I) Can't copy state everywhere.
- (II) Can't re-compute everything from scratch for each universe.

### Snapshot

$$DB_{t^*} = \begin{cases} (e \ a \ v \ t) \mid t \le t^* \end{cases}$$

No Retractions (for now)

### Multiplicities



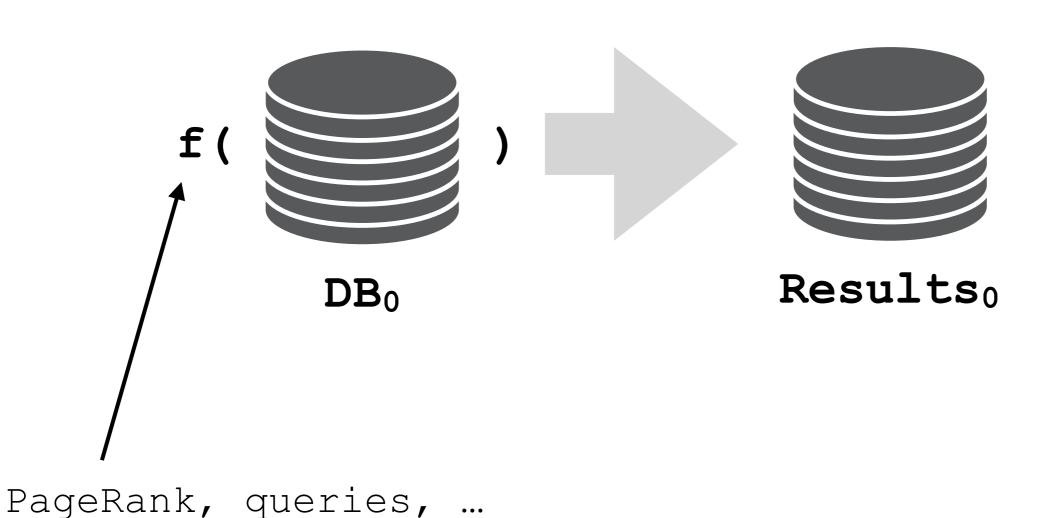
- Addition: +1, Retraction: -1
- Sets become Bags
- Store Diffs, not full Snapshots

## Implementation Challenges?

(I) Can't copy state everywhere.

(II) Can't re-compute everything from scratch for each universe.

### Computing w/ Snapshots



### Incremental Computation





How do we find  $\partial f$ ?

### Differential Dataflow

- Incrementalized computational framework
- Fine-grained concurrency: partial orders!
- Data-parallel & distributable
- github.com/TimelyDataflow

Think in f, get distributable  $\delta f$  for free!

```
/// BFS
let nodes = roots.map(|x| (x, 0));
nodes.iterate(|inner| {
 let edges = edges.enter(&inner.scope());
 let nodes = nodes.enter(&inner.scope());
 inner.join_map(&edges, |_k,l,d| (*d, l+1))
      .concat(&nodes)
      •group(|_, s, t| t.push((*s[0].0, 1)))
})
```

### We Talked About Time!

#### 1. Semantics

- Epochs for basic sanity
- Multitemporal for undo/redo
- Multidimensional for versioning
- 2. Efficient Implementation
  - Store Diffs, not Snapshots
  - Incremental Computation
  - Differential Dataflow

# OCCIONATION OF THE PROPERTY OF

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