

# Advanced Data Structures

## Lecture 10: Temporal Data Structures 2

Florian Kurpicz

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# Organization

## Exams

- 12.09.2023, 13.09.2023, and 21.09.2023 (09:00–16:00)
- 22.09.2023 (13:00–16:00)
- write to `blancani@kit.edu`
  - full name
  - Matrikelnummer
  - PO version
  - date
- in person
- 17.07.2022 Q&A during last half of lecture
- registration for project is open

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## Evaluation

- next week

# Range Minimum Queries in $O(1)$ Time and $O(n \log n)$ Space

- instead of storing all solutions
- store solutions for intervals of length  $2^k$  for every  $k$
- $M[0..n][0..\lfloor \log n \rfloor]$

## Queries

- query  $rmq(A, s, e)$  is answered using two subqueries
- let  $\ell = \lfloor \log(e - s + 1) \rfloor$
- $m_1 = rmq(A, s, s + 2^\ell - 1)$  and  $m_2 = rmq(A, e - 2^\ell + 1, e)$
- $rmq(A, s, e) = \arg \min_{m \in \{m_1, m_2\}} A[m]$

## Construction

$$\begin{aligned}
 M[x][\ell] &= rmq(A, x, x + 2^\ell - 1) \\
 &= \arg \min \{A[i] : i \in [x, x + 2^\ell)\} \\
 &= \arg \min \{A[i] : i \in \{rmq(A, x, x + 2^{\ell-1} - 1), \\
 &= \quad \quad \quad rmq(A, x + 2^{\ell-1}, x + 2^\ell - 1)\}\} \\
 &= \arg \min \{A[i] : i \in \{M[x][\ell - 1], \\
 &= \quad \quad \quad M[x + 2^{\ell-1}][\ell - 1]\}\}
 \end{aligned}$$

- dynamic programming in  $O(n \log n)$  time



<https://pingo.scc.kit.edu/919720>

# Recap: Persistent Data Structures

- lecture based on: <http://courses.csail.mit.edu/6.851/spring12/lectures/L01>

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- change in the past creates new branch
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- everything old/new remains the same

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### Definition: Partial Persistence

Only the latest version can be updated

### Definition: Full Persistence

Any version can be updated

### Definition: Confluent Persistence

Like full persistence, but two versions can be combined to a new version

### Definition: Functional

Nodes cannot be modified, only new nodes can be created



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## Persistence

- change in the past creates new branch
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## Retroactivity

- change in the past affects future
- make change in earlier version changes all later versions

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Only the latest version can be updated

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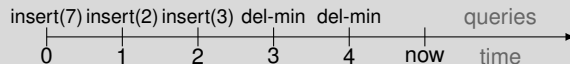
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# Retroactive Data Structures

## Operations

- $\text{INSERT}(t, \text{operation})$ : insert operation at time  $t$
- $\text{DELETE}(t)$ : delete operation at time  $t$
- $\text{QUERY}(t, \text{query})$ : ask  $\text{query}$  at time  $t$

- for a priority queue updates are
  - insert
  - delete-min
- time is integer ⓘ for simplicity otherwise use order-maintenance data structure

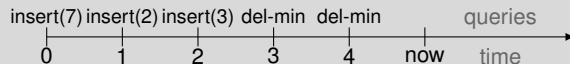


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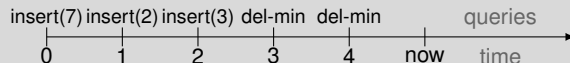
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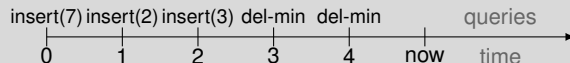
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QUERY is only allowed for  $t = \infty$  ⓘ now

## Definition: Full Retroactivity

QUERY is allowed at any time  $t$

## Definition: Nonoblivious Retroactivity

INSERT, DELETE, and QUERY at any time  $t$  but also identify changed QUERY results

## Easy Cases: Partial Retroactivity

- invertible updates
  - operation  $op^{-1}$  such that  $op^{-1}(op(\cdot)) = \emptyset$
  - DELETE becomes INSERT inverse operation
- makes partial retroactivity easy
- $INSERT(t, operation) = INSERT(\infty, operation)$
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## Partial Retroactivity

- hashing
- dynamic dictionaries
- array with updates only ⓘ  $A[i]_+ = value$

# Search Problems

## Definition: Search Problem

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- range minimum queries

- nearest neighbor
- point location
- ...

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- these types of problems are also “easy”

# Decomposable Search Problems: Full Retroactivity

## Lemma: Full Retroactivity for DSP



Every decomposable search problems can be made fully retroactive with a  $O(\log m)$  overhead in **space** and **time**, where  $m$  is the number of operations

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## Proof (Sketch)



- use balanced search tree  segment tree
- each leaf corresponds to an update
- node  $n$  corresponds to interval of time  $[s_n, e_n]$
- if an object exists in the time interval  $[s, e]$ , then it appears in node  $n$  if  $[s_n, e_n] \subseteq [s, e]$  if none of  $n$ 's ancestors' are  $\subseteq [s, e]$  
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- $O(\log m)$  results which can be combined in  $O(\log m)$  time

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- data structure is stored for each operation!
- $O(\log m)$  space overhead!



# General Full Retroactivity

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Rewinding  $m$  operations has a lower bound of  $\Omega(m)$  overhead

- general case

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- initially  $X = \emptyset$  and  $Y = \emptyset$
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  - $Y+ = value$
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- what are we computing here?



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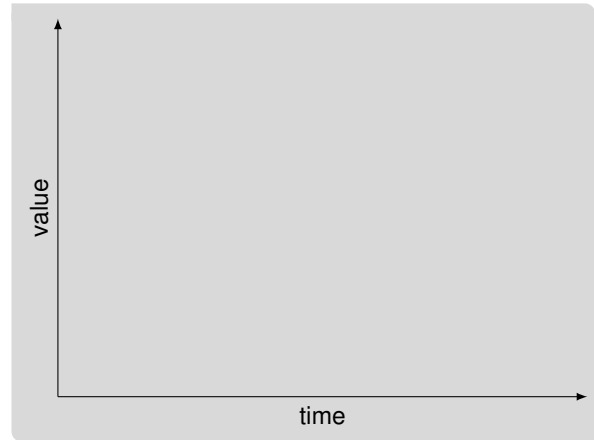
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- evaluate polynomial at  $X = x$  using  $t=0, X=x$
- this requires  $\Omega(n)$  time [FHM01]

# Priority Queues: Partial Retroactivity (1/6)

- priority queue with
  - insert
  - delete-min
- delete-min makes PQ non-commutative

## Lemma: Partial Retroactive PQ

A priority queue can be partial retroactive with only  $O(\log n)$  overhead per partially retroactive operation

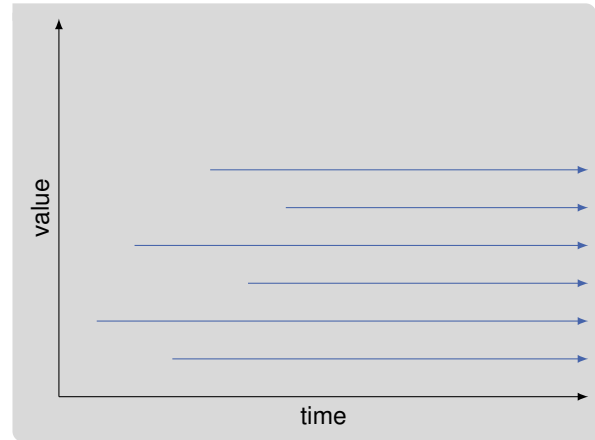


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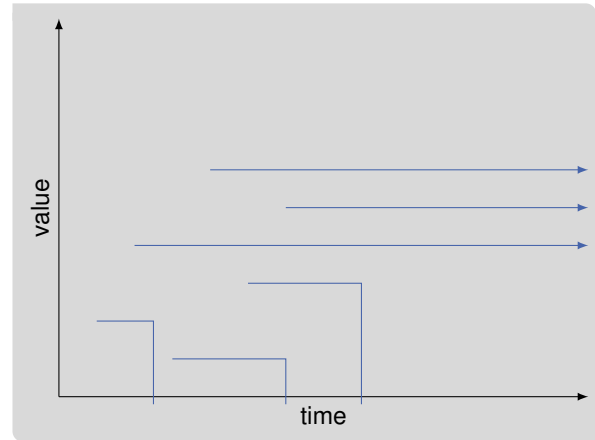


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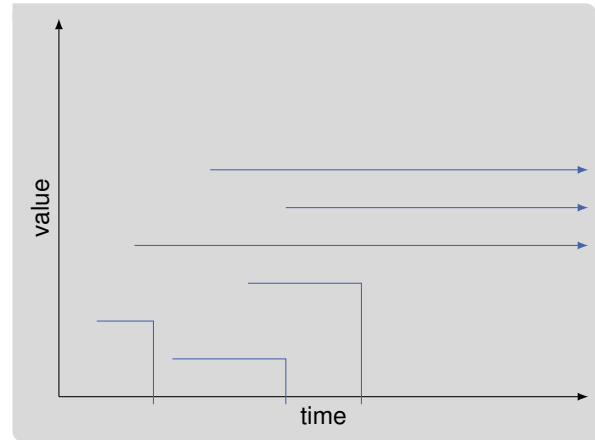
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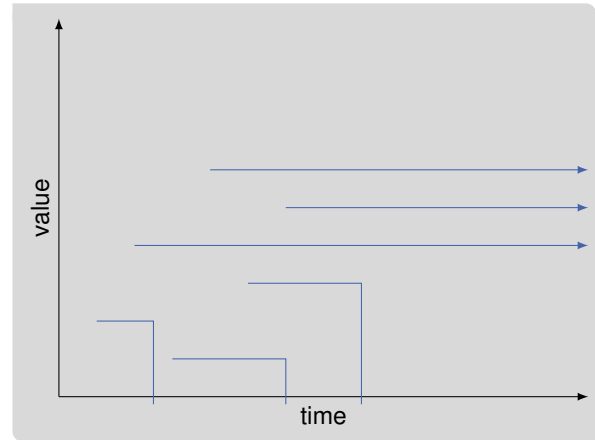
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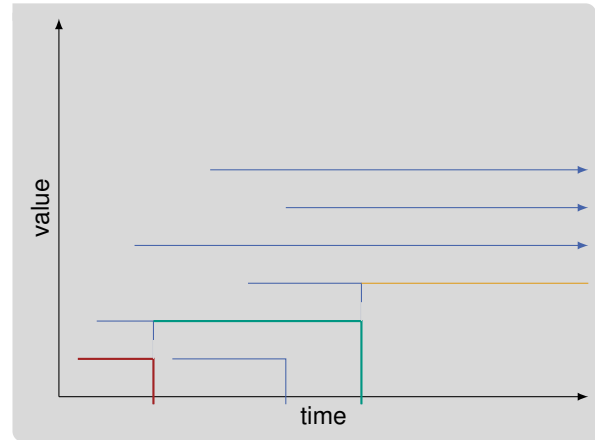
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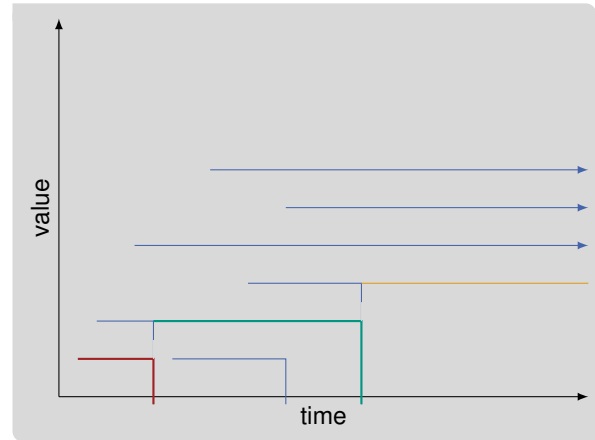
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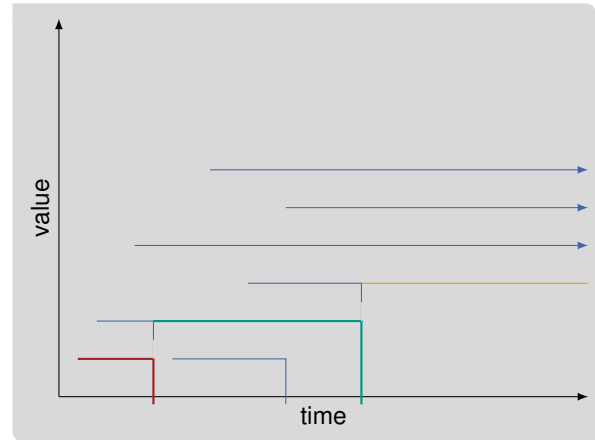
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- can we solve `DELETE(t, delete-min())` using `INSERT(t, insert(i))`?  **PINGO**



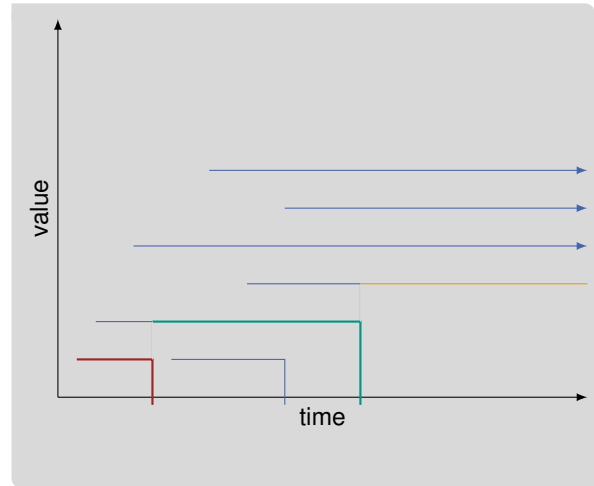
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- can we solve  $\text{DELETE}(t, \text{delete-min}())$  using  $\text{INSERT}(t, \text{insert}(i))$ ?  **PINGO**
- insert deleted minimum right after deletion



## Priority Queues: Partial Retroactivity (3/6)

- let  $Q_t$  be elements in PQ at time  $t$
- what values are in  $Q_\infty$ ? ⓘ partial retroactivity
- what value inserts  $\text{INSERT}(t, \text{insert}(v))$  in  $Q_\infty$
- values is  $\max\{v, v' : v' \text{ deleted at time } \geq t\}$
- maintaining deleted elements is hard ⓘ can change a lot



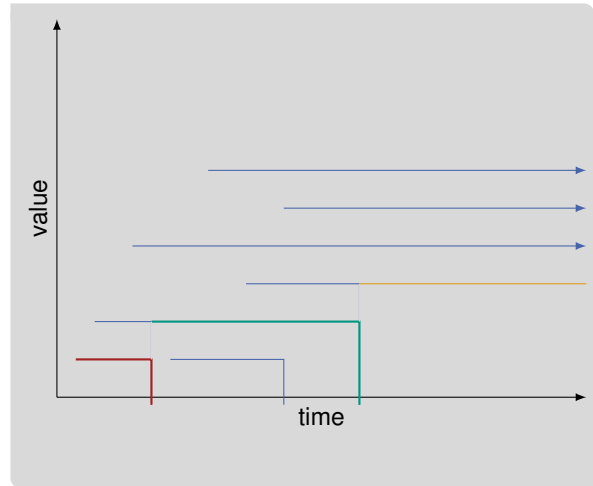
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## Definition: Bridge

A time  $t'$  is a bridge if  $Q_{t'} \subseteq Q_\infty$

- all elements present at  $t'$  are present at  $t_\infty$





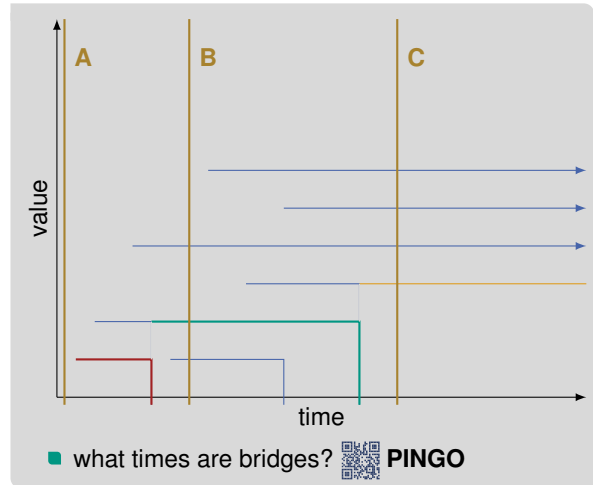
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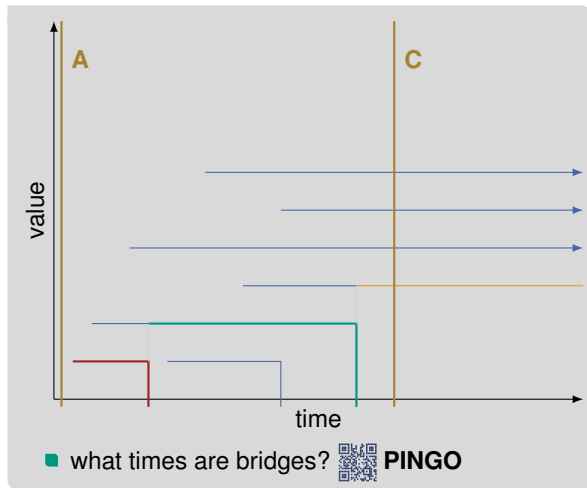
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## Priority Queues: Partial Retroactivity (4/6)

### Lemma: Deletions after Bridges

If time  $t'$  is closest bridge preceding time  $t$ , then

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### Proof (Sketch)

- $\max\{v' \notin Q_\infty : v' \text{ inserted at time } \geq t'\} \in \{v' : v' \text{ deleted at time } \geq t\}$ 
  - if maximum value is deleted between  $t'$  and  $t$
  - then this time is a bridge
  - contradicting that  $t'$  is bridge preceding  $t$

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  - if maximum value is deleted between  $t'$  and  $t$
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  - then it is not in  $Q_\infty$

# Priority Queues: Partial Retroactivity (4/6)

## Lemma: Deletions after Bridges

If time  $t'$  is closest bridge preceding time  $t$ , then

$$\max\{v' : v' \text{ deleted at time } \geq t\}$$

=

$$\max\{v' \notin Q_\infty : v' \text{ inserted at time } \geq t'\}$$

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- what values are in  $Q_\infty$ ? ⓘ partial retroactivity
- what value inserts  $\text{INSERT}(t, \text{insert}(v))$  in  $Q_\infty$
- $\max\{v, v' \notin Q_\infty : v' \text{ inserted at time } \geq t'\}$

## Priority Queues: Partial Retroactivity (5/6)

- keep track of inserted values
- use balanced binary search trees for  $O(\log n)$  overhead

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- update all BBSTs in  $O(\log n)$  time

# Priority Queues: Partial Retroactivity (6/6)

## Lemma: Partial Retroactive PQ

A priority queue can be partial retroactive with only  $O(\log n)$  overhead per partially retroactive operation

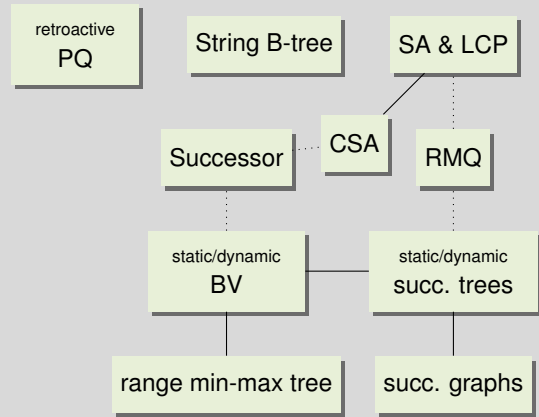
- requires three BBSTs
- updates need to update all BBSTs

# Conclusion and Outlook

## This Lecture

- retroactive data structures

## Advanced Data Structures





# Conclusion and Outlook

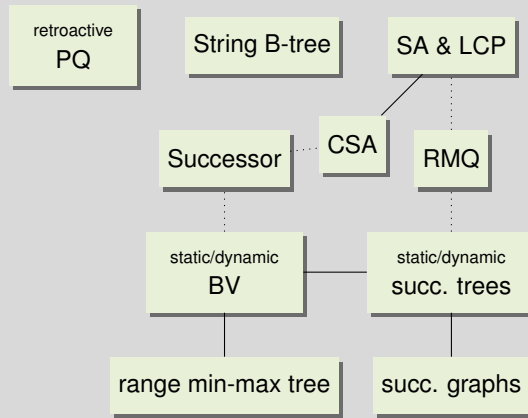
## This Lecture

- retroactive data structures

## Next Lecture

- (minimal) perfect hashing

## Advanced Data Structures



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