

**Integer Priority Queues with  
Decrease Key in Constant Time  
and the  
Single Source Shortest  
Paths Problem**

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Based on:

Mikkel Thorup. Integer priority queues with decrease key in constant time and the single source shortest paths problem. *Journal of Computer and System Sciences*, 69(3):330–353, 2004. Announced at STOC'03.

## The short story

Directed graph  $G$ ,  $n$  nodes,  $m$  edges  
with integer weights in  $[0, C)$ .

We solve single source shortest path problem  
in time

$$O(m + n \log \log n) \text{ or } O(m + n \log \log C)$$

Ahuja, Mehlhorn, Orlin, and Tarjan (1990):

*Based on van Emde Boas'  $O(m \log \log C)$   
one might hope for  $O(m + n \log \log C)$ .*

They got  $O(m + n(\log C)^{1/2})$ .

Previous best  $O(m + n(\log C)^{1/4-\varepsilon})$   
by Raman (1997) using randomization.

## History in terms of $C$

—all using integer RAM model

$O(m + nC)$  Dial 1969

$O^r(m \log \log C)$  van Emde Boas' data structure 1977

$O(m + n \log C)$  Denardo and Fox 1979

$O(m + n(\log C)^{1/2})$  Ahuja, Mehlhorn, Tarjan 1990

$O^r(m + n(\log C)^{1/3+\varepsilon})$  Cherkassky, Goldberg, Silverstein 1997.

$O^r(m + n(\log C)^{1/4+\varepsilon})$  Raman 1997.

$\omega$

$O(m + n \log \log C)$  this paper

## History in terms of $n$

$O(m + n^2)$  Dijkstra 1959

$O(m \log n)$  William's heap 1964

$O(m + n \log n)$  Fredman and Tarjan 1984

—now switch to integer RAM model

$O(m + n(\log n)/(\log \log n))$  Fredman and Willard 1993

$O^r(m + n(\log n)^{1/2+\varepsilon})$  and  $O^r(m(\log \log n))$  Thorup 1995

$O^r(m + n(\log n)^{1/3+\varepsilon})$  Raman 1997

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$O(m + n \log \log n)$  this paper

## Technical contribution

Fibonacci heap style priority queue  $Q$   
over up to  $n$  keys  $a$  with values  $v(a) \in [0, N)$

find-min( $Q$ ): returns min-key in  $Q$

insert( $Q, a$ ): adds  $a$  to  $Q$

dec-key( $Q, a, x$ ): sets  $v(a) := v(a) - x$

delete( $Q, a$ ) deletes  $a$  from  $Q$

All operations but delete in constant time.

Delete time  $d \rightarrow$

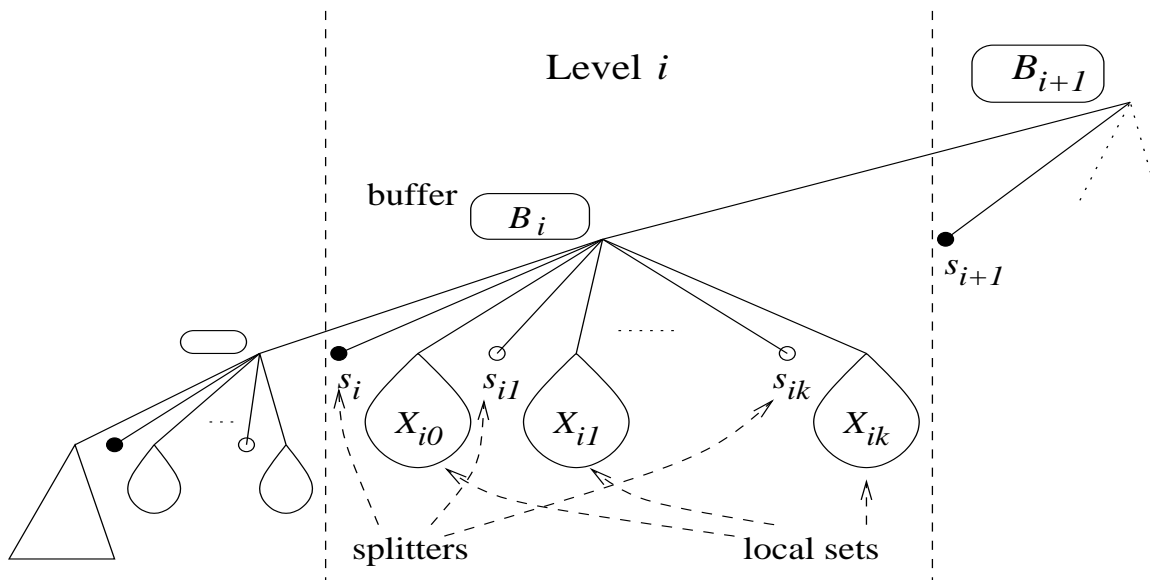
single source shortest paths time  $O(m + nd)$

Fibonacci heap gets delete time  $d = O(\log n)$

For integers, we get delete time  $d = O(\log \log n)$

## Structure of our priority queue

left branch of buffered exponential search tree



$$n_i = (\log^2 n)^{(5/4)^i}$$

Level  $i > 0$  has

$\Theta(n_i)$  keys

$\Theta(n_i^{1/3})$  splitters and local sets

local set size  $\Theta(n_i^{2/3})$

buffer size  $O(n_i^{1/2})$

and level  $i - 1$  has  $\Theta(n_i^{4/5})$  keys

**Lemma** (Han&Thorup FOCS'02)

Split  $q$  keys over  $q^{1-\varepsilon}$  splitters in linear time

↓

When  $B_i$  full with  $|B_i| = \Theta(n_i^{1/2})$ , split over  $\Theta(n_i^{1/3})$  splitters in linear time.

↓

Using buffers, distribute keys over local sets in  $O(1)$  time per key.

The  $O(1)$  includes re-balancing between local sets:

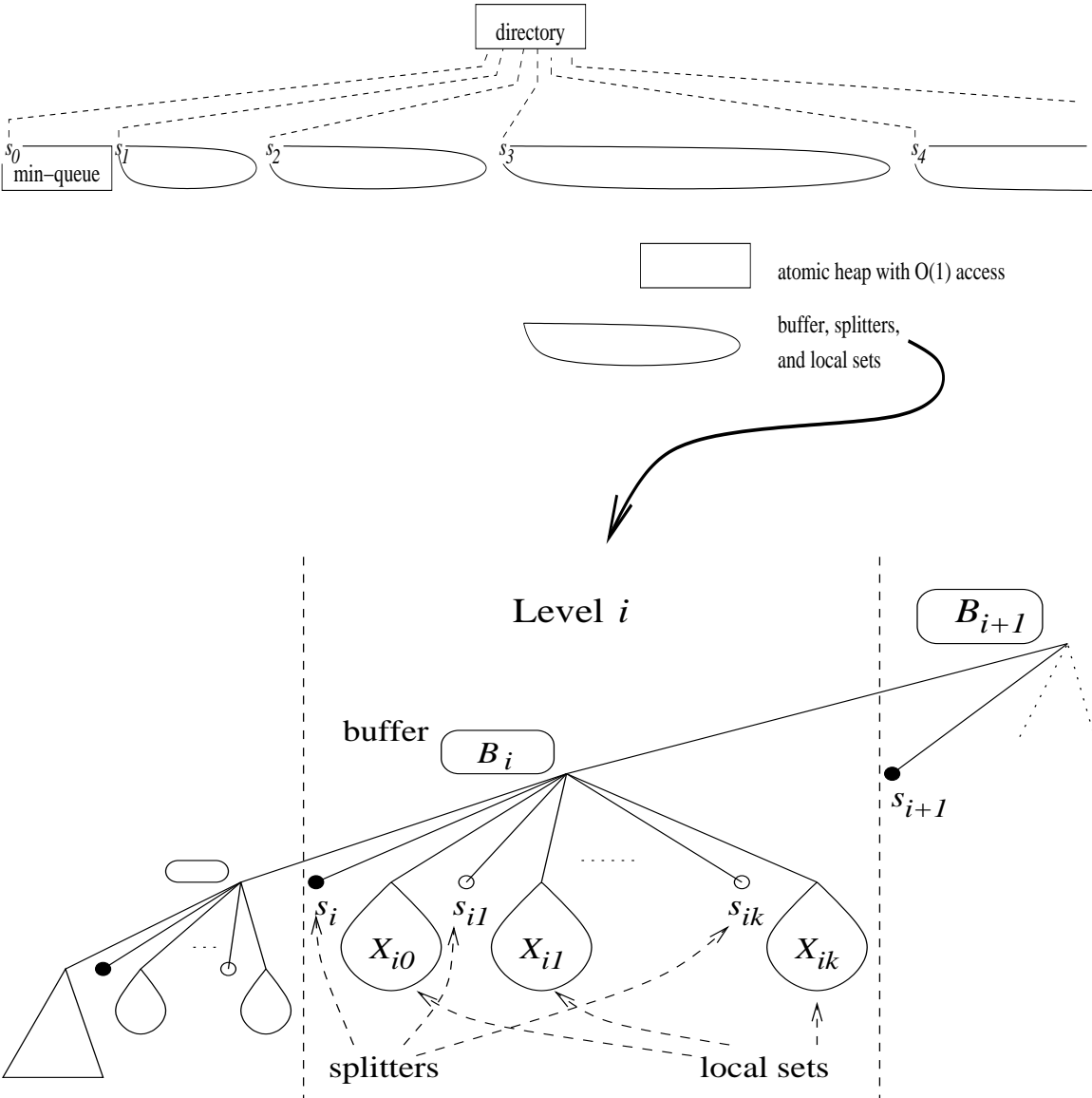
- Too much added to a local set pays split.
- Too much removed from a local set pays for merge or exchange with neighbor.

With  $O(\log \log n)$  levels, easy priority queue with insert and delete in  $O(\log \log n)$  time ...

but that's known :-)

What about dec-key?

# Global-local view

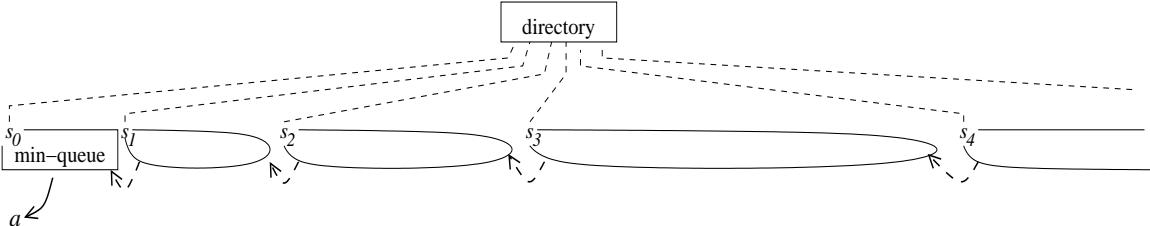


Using min-queue, find-min in  $O(1)$  time

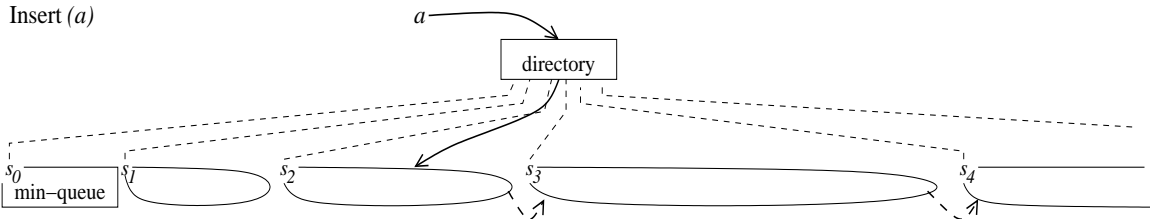


# Updates

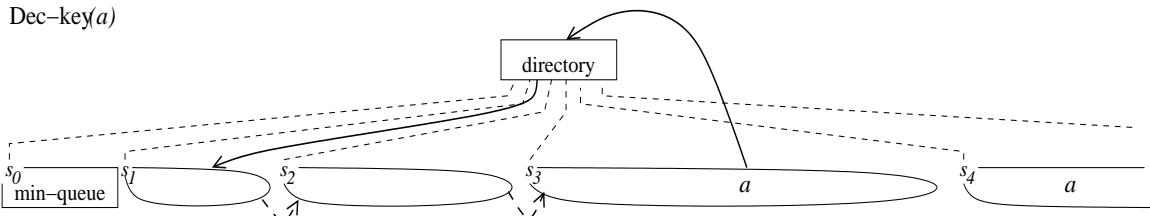
Delete ( $a$ )



Insert ( $a$ )



Dec-key( $a$ )



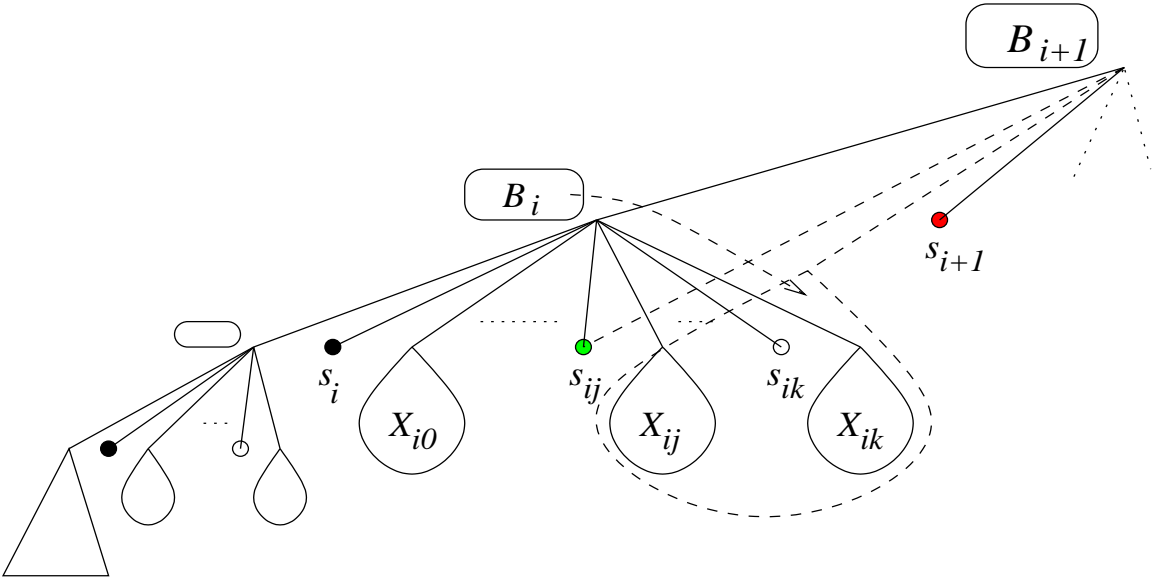
—————> immediate operation  
 - - - - -> moving key for balance

Moving key down in constant time  
 → delete in  $O(\log \log n)$  time

If we can move keys up in  $O(1/n_i^{1/3})$  time  
 → insert and dec-key time

$$O(1 + \sum_i n_i^{-1/3}) = O(1)$$

# Moving up



Collect local level  $i$  sets creating a new local level  $i + 1$  set

Preceding local splitter new level splitter  $s_{i+1}$

Include keys from  $B_i$  bigger than new  $s_{i+1}$

## Analysis

Move up  $\Theta(n_{i+1}^{2/3}) = \Theta(n_i^{5/6})$  keys

Collect  $\Theta(n_i^{5/6}/n_i^{2/3}) = \Theta(n_i^{1/6})$  local level  $i$  sets in  $\Theta(n_i^{1/6})$  time

Scan level  $i$  buffer in  $O(n_i^{1/2})$  time

Moving up in  $O(n_i^{1/2}/n_i^{5/6}) = O(n_i^{-1/3})$  time per key

: details and de-amortization in journal paper.

**Theorem** Priority queue over  $n$  integer keys in  $[0, N)$  supporting find-min, insert, and dec-key in constant time, and delete in time  $O(\log \log n)$  or  $O(\log \log N)$  ■

**Corollary** For directed graph with  $n$  nodes and  $m$  edges with integer weights in  $[0, C)$ , single source shortest path in time  $O(m + n(\log \log n))$  or  $O(m + n(\log \log C))$  ■

## Concluding remarks

Without multiplication, monotone priority queue with delete in  $O((\log \log n)^{1+\varepsilon})$  time, hence single shortest paths in time

$$O(m + n(\log \log n)^{1+\varepsilon})$$

## Open problems

**(1)** Without dec-key in constant time, using randomization, we can insert and delete in  $O(\sqrt{\log \log n})$  expected time (Thorup FOCS'02).

Can we get such delete time with insert and dec-key in constant time?

**(2)** A general reduction (Thorup FOCS'02) shows that the per key costs of sorting and priority queues are asymptotically equivalent.

Is there a general construction augmenting a priority queue supporting insert and delete with dec-key in constant time?

Above **(2)**  $\Rightarrow$  **(1)**

## Exercises for directed SSSP

- The result uses that we can split  $q$  keys over  $q^{1-\varepsilon}$  splitters in linear time. What happens if we could only handle  $\log q$  splitters? or if we could handle  $q/\log n$  splitters.
- Currently the directory is implemented with an atomic heap. Show that we can implement a directory with splitters instead.
- Is there any reasonable way of using the ideas in practice?