

# Deterministic Cache-Oblivious Funnelselect

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AARHUS  
UNIVERSITY

Sebastian Wild

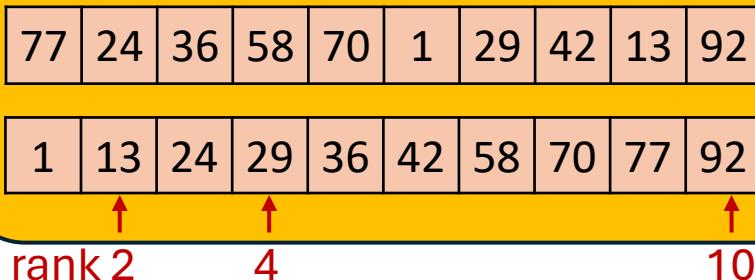


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LIVERPOOL

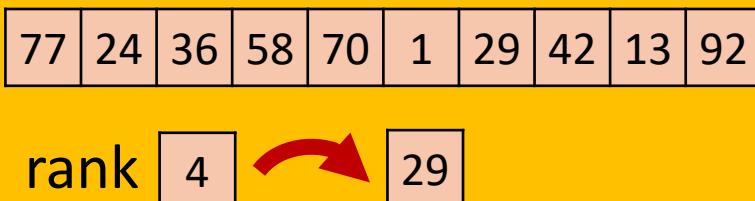


# Problem

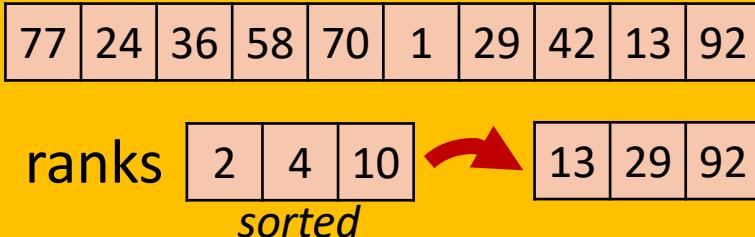
## Sorting



## Single selection



## Multiple selection



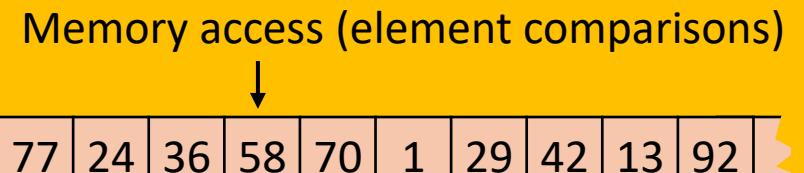
# Algorithm

## Randomized

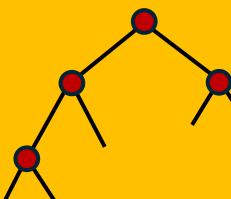


# Computational Model

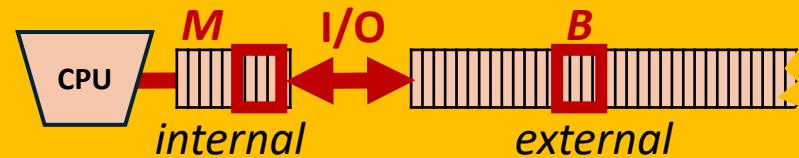
## Internal memory



## Deterministic



## External memory Cache aware, I/O

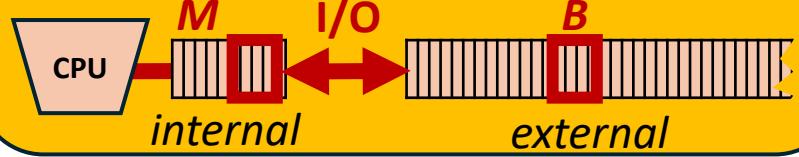


Aggarwal, Vitter 1988

Result  
of this talk

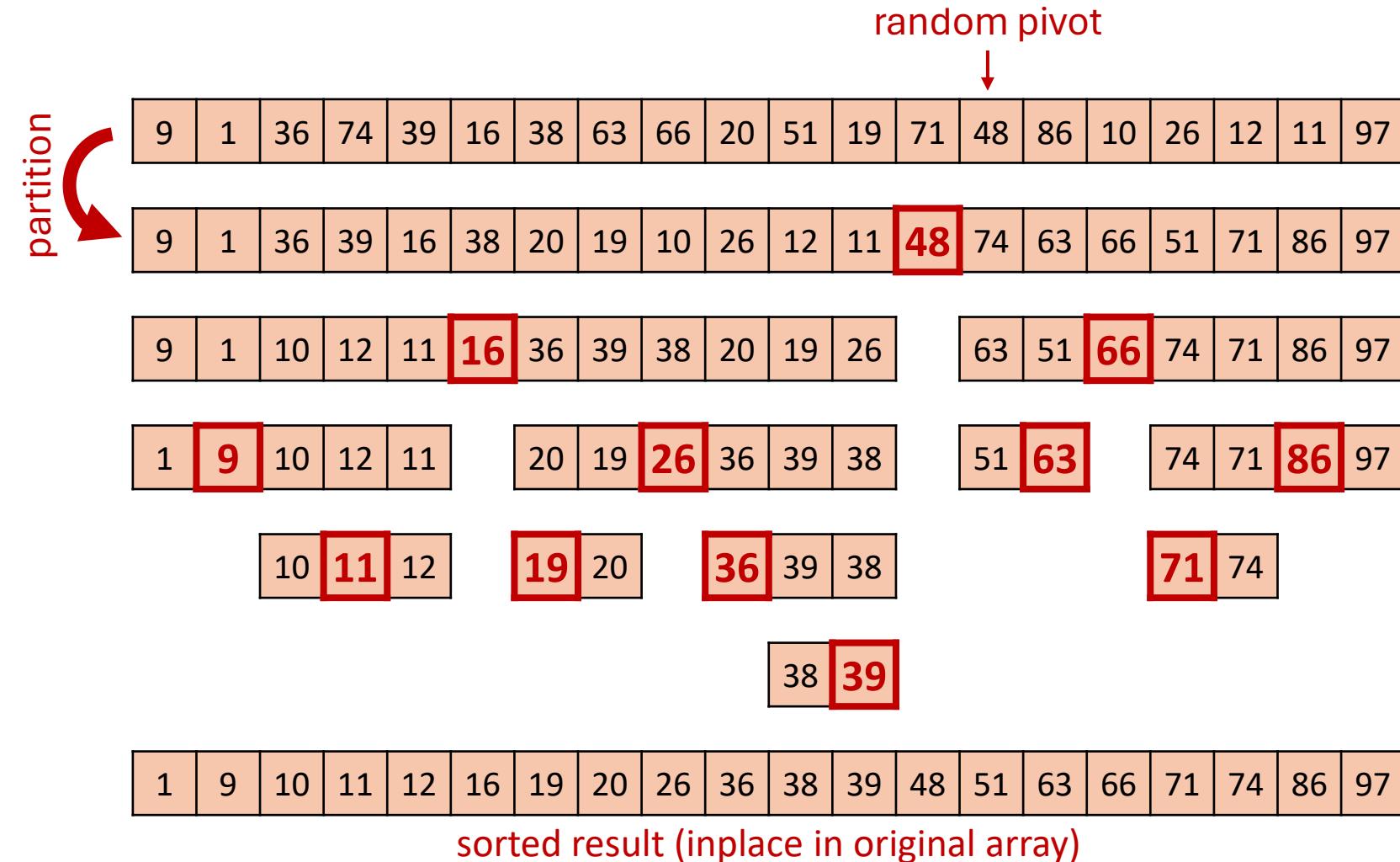
## Cache oblivious

Algorithms do not know  $B$  and  $M$   
(optimal offline cache replacement)



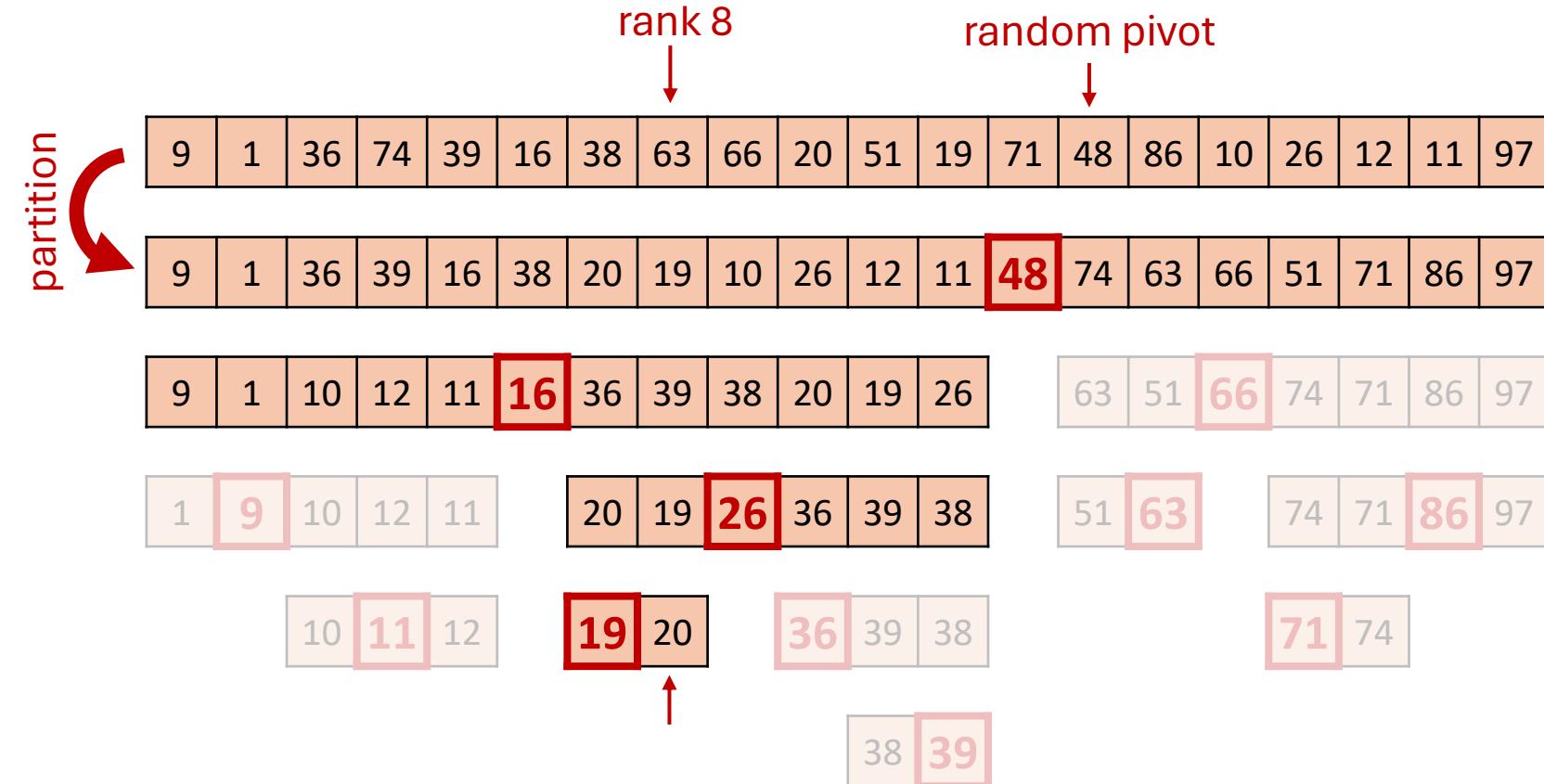
Frigo, Leiserson, Prokop, Ramachandran 1999

# Internal Memory Sorting – Randomized Quicksort



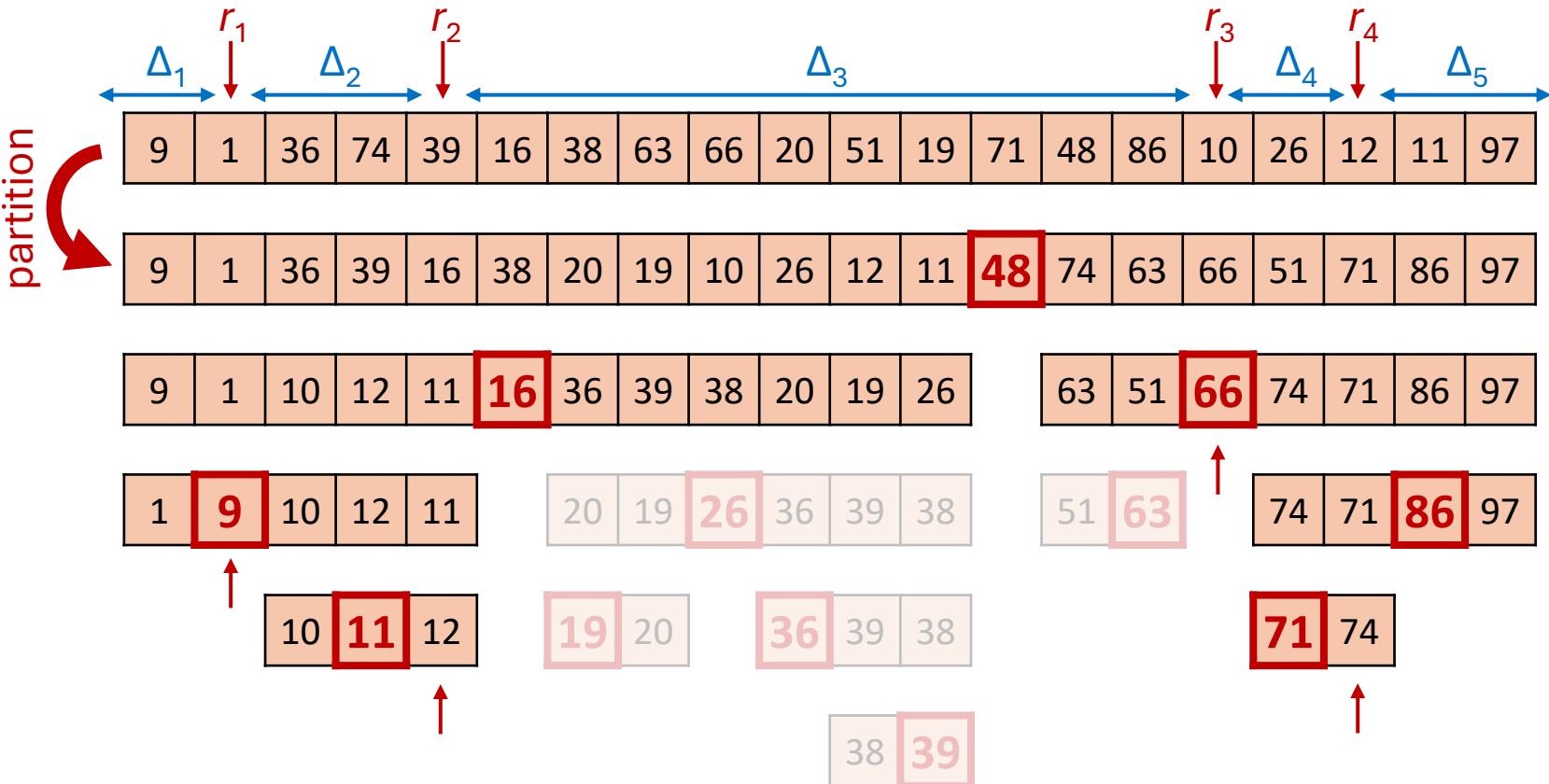
- [Hoare 1959]
- Expected time
- $O(n \log_2 n)$

# Internal Memory Single Selection – Randomized



- Quickselect  
[Hoare 1961]
- Expected time  
 $O(n)$

# Internal Memory Multiple Selection – Randomized



- Multiple selection [Chambers 1971]
- Expected time  $O(n \log_2 q)$  for  $q$  queries
- Expected time [Prodinger 1995]

$$\mathcal{B} = \sum_{i=1}^{q+1} \Delta_i \log_2 \frac{n}{\Delta_i}$$

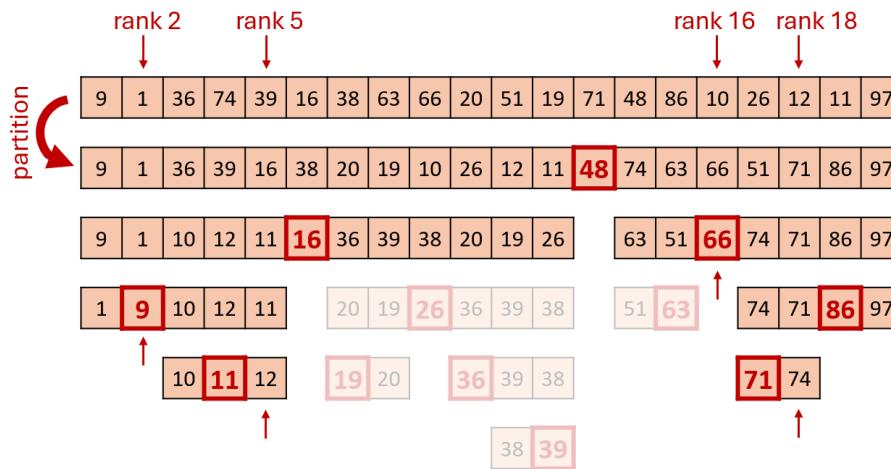
(query rank entropy)

# Internal Memory Multiple Selection – Deterministic

Multiple selection  
[Chambers 1971]



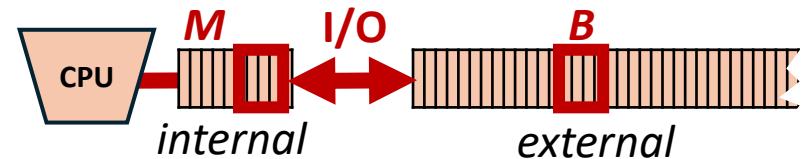
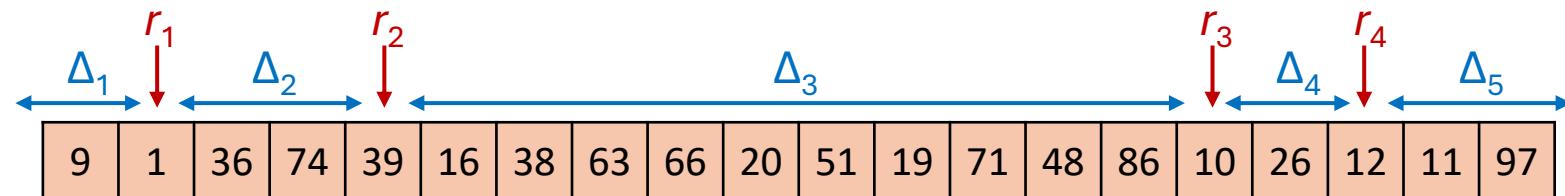
Deterministic linear median → pivots  
[Blum, Floyd, Pratt, Rivest, Tarjan 1973]



Deterministic multiple selection  
[Dobkin, Munro 1981]  
optimal  $O(\mathcal{B} + n)$  time

	Internal memory	Cache-oblivious I/Os	Cache-oblivious Optimal I/Os ?
<b>Sorting</b>	$O(n \log_2 n)$	$O\left(\frac{n}{B} \log_2 \frac{n}{M}\right)$	$O\left(\frac{n}{B} \log_{M/B} \frac{n}{M}\right)$
<b>Single selection</b>	$O(n)$	$O(n / B)$	$O(n / B)$
<b>Multiple selection</b>	$O(B + n)$	$O(n / B + \mathcal{B} / B)$	$O(n / B + \mathcal{B} / B / \log_2 \frac{M}{B})$

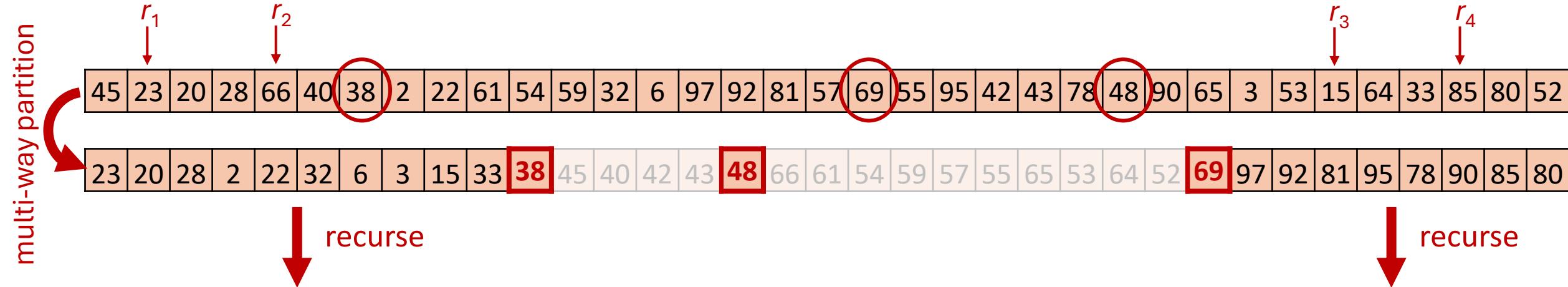
$\mathcal{B} = \sum_{i=1}^{q+1} \Delta_i \log_2 \frac{n}{\Delta_i}$   
(query rank entropy)



*Lower bound*  
[Dobkin, Munro 1981] +  
[Arge, Knudsen, Larsen 1993]

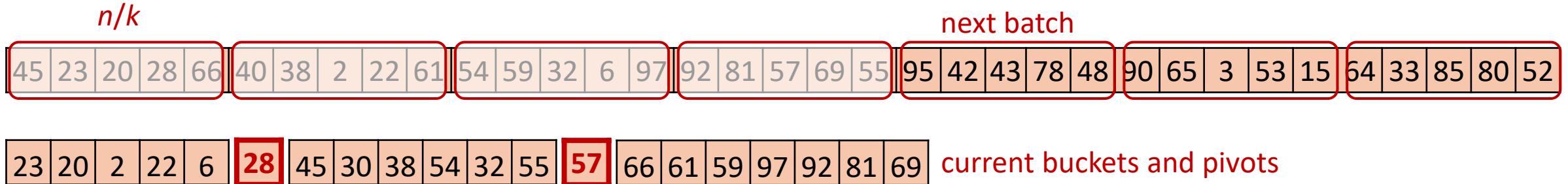
*Upper bounds*  
Randomized [ESA 2023]  
Deterministic [SWAT 2024]

# Cache-aware Multiple Selection – Randomized



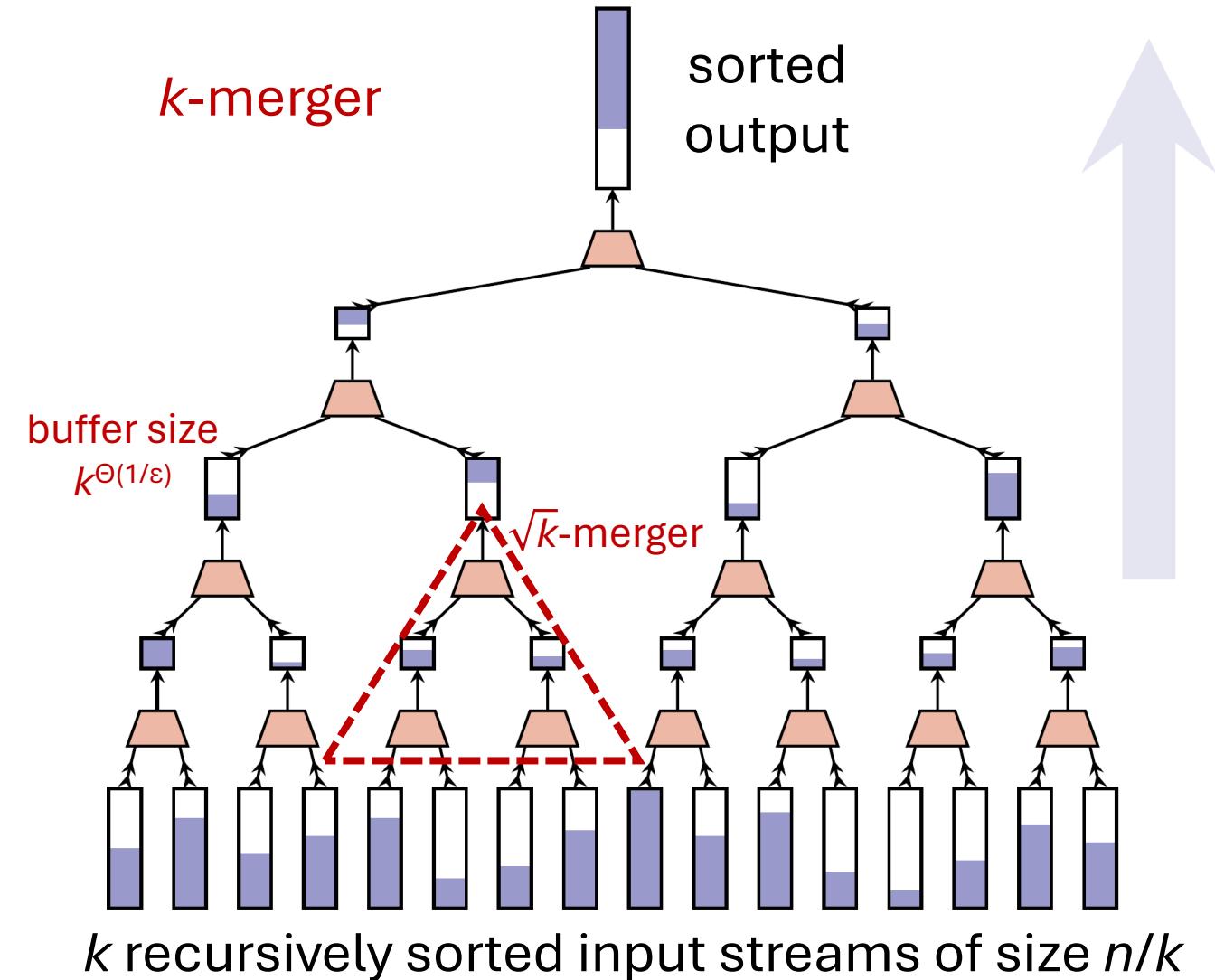
- Pick  $\Theta(M/B)$  random pivots and distribute to buckets
- Recurse on buckets with queries (à la Chambers)
- Expected optimal  $O(n / B + \mathcal{B} / B / \log_2 \frac{M}{B})$  I/Os

# Cache-aware Multi-way Partition – Deterministic



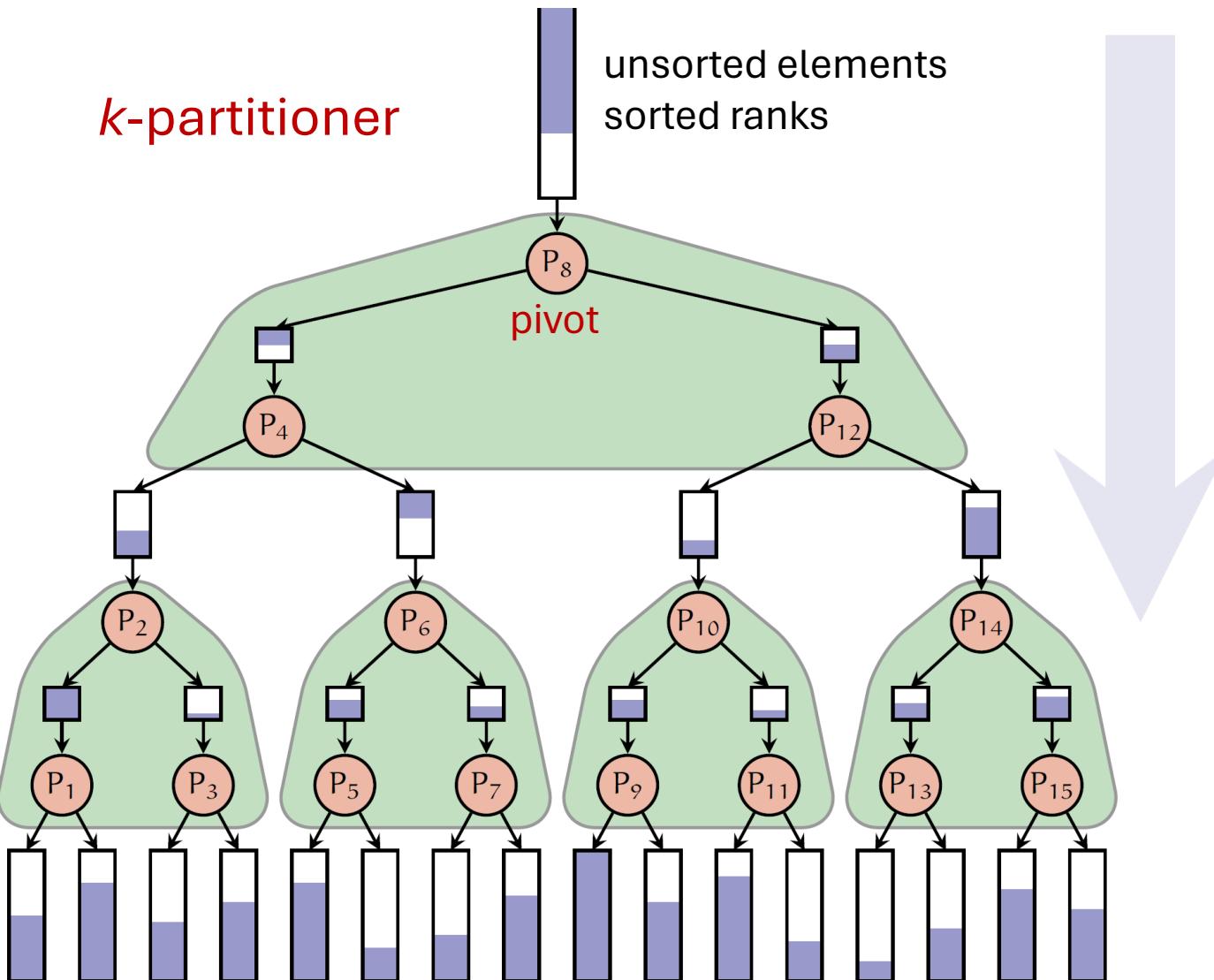
- **Goal :**  $k = \Theta(M/B)$  buckets each of size  $[n/k, 2n/k]$
  - Repeatedly **distribute batches** of  $n/k$  elements into buckets (initially one)
  - Split **overflowing buckets** ( $> 2 \cdot n/k$  elements; at most  $3n/k$ )  
[using Blum *et al.* median finding algorithm; median new pivot]
  - **Distribution sort** :  $O\left(\frac{n}{B} \log_{M/B} \frac{n}{M}\right)$  I/Os and  $O(n \log n)$  internal work
  - **Multiple selection** :  $O(n / B + \mathcal{B} / B / \log_2 \frac{M}{B})$  I/Os
- [Hu, Tao, Yang, Zhou 2014] achieved both I/O and work optimality

# Cache-oblivious Funnelsort – Deterministic



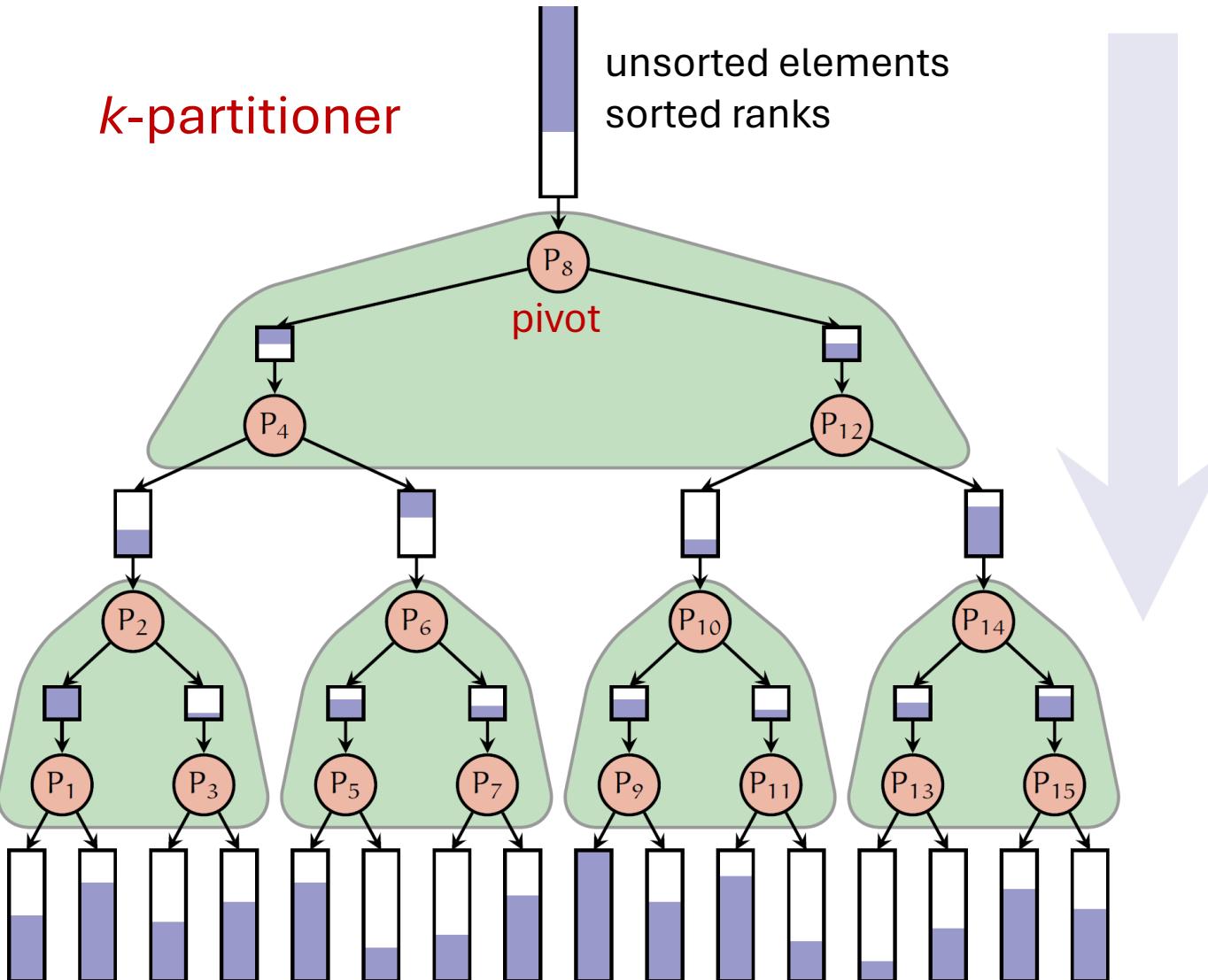
- Tall cache assumption  
 $M \geq B^{1+\varepsilon}$   
Necessary [Brodal, Fagerberg 2002]
- Binary mergesort with buffered output
- **$k$ -merger**,  $k = n^{\Theta(\varepsilon)}$
- $O\left(\frac{n}{B} \log_{M/B} \frac{n}{M}\right)$  I/Os

# Cache-oblivious Multiple Selection – Idea



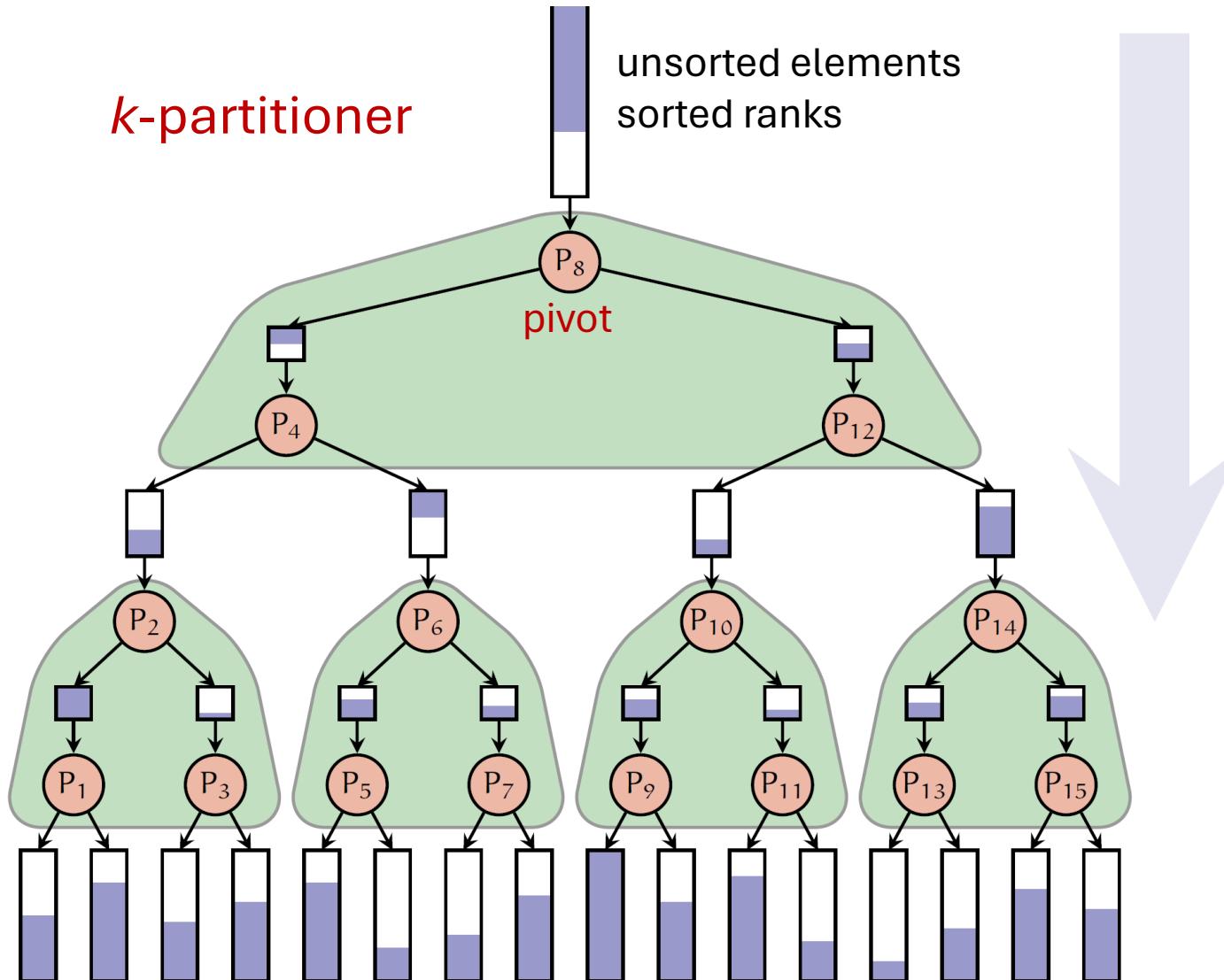
- Reverse computation of  $k$ -merger → *k-partitioner*
- algorithm à la Chambers
- Challenges
  - Pivots ?
  - Pruning subtree computations before knowing ranks of pivots ?

# Cache-oblivious Multiple Selection – Randomized



- Sort  $n / \log n$  size sample
- Select  $k = n^{\Theta(\varepsilon)}$  pivots uniformly in sample
- Estimate pivot ranks within  $\pm n^{2/3}$  w.h.p.
- Prune **inside *k*-partitioner** subtrees w.h.p. no query
- Buckets just sort
- Expected  $O(n / B + \mathcal{B} / B / \log_2 \frac{M}{B})$  I/Os

# Cache-oblivious Multiple Selection – Deterministic

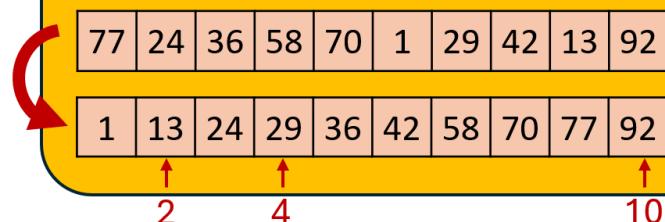


- Entropy bound  $\approx \text{sort} \rightarrow \text{sort}$
  - Otherwise, small  $k \leq n^{\Theta(\varepsilon)}$
  - Prune buckets with no query
    - $\geq n/2$  elements pruned
  - Recurse on buckets
  - Pivots deterministically
    - Incremental batches of size  $n/k$
    - Split bucket + rebuild  $k$ -partitioner
  - $O(n / B + \mathcal{B} / B \log_2 \frac{M}{B})$  I/Os
- $k = n/\Delta$
- $$\Delta = \min \{ \Delta_i \mid \sum_{\Delta_j \leq \Delta_i} \Delta_j \geq n/2 \}$$

# Summary

## Problems

### Sorting



### Single selection



### Multiple selection

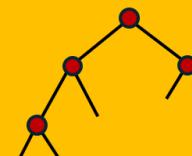


## Algorithm

### Randomized



### Deterministic



Result  
of this talk

## Computational Model

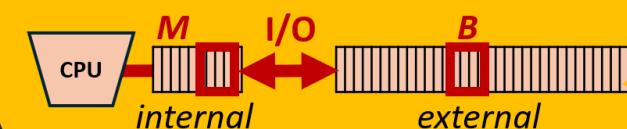
### Internal memory

Memory access (element comparisons)



### External memory

Cache aware, I/O



Aggarwal, Vitter 1988

### Cache oblivious

Algorithms do not know  $B$  and  $M$   
(optimal offline cache replacement)



Frigo, Leiserson, Prokop, Ramachandran 1999

Optimal  $O(n / B + \mathcal{B} / B \log_2 \frac{M}{B})$  I/Os