

# Understanding the Inverse Ackermann Function

Raimund Seidel

Universität des Saarlandes

Ackermann function - Wikipedia, the free encyclopedia - Mozilla Firefox

Datei Bearbeiten Ansicht Gehe Lesezeichen Extras Hilfe

W http://en.wikipedia.org/wiki/Ackerman's\_function Go

LS FR Inf Uni mpi AG Kurt mpi MPI mpi Talks DBLP W Wikipedia

A two-parameter variation of the inverse Ackermann function can be defined as follows:

$$\alpha(m, n) = \min\{i \geq 1 : A(i, \lfloor m/n \rfloor) \geq \log_2 n\}.$$

This function arises in more precise analyses of the algorithms mentioned above, and gives a more refined time bound. In the [disjoint-set data structure](#),  $m$  represents the number of operations while  $n$  represents the number of elements; in the [minimum spanning tree](#) algorithm,  $m$  represents the number of edges while  $n$  represents the number of vertices. Several slightly different definitions of  $\alpha(m, n)$  exist; for example,  $\log_2 n$  is sometimes replaced by  $n$ , and the [floor function](#) is sometimes replaced by a [ceiling](#).

Fertig

Ackermann function - Wikipedia, the free encyclopedia - Mozilla Firefox

Datei Bearbeiten Ansicht Gehe Lesezeichen Extras Hilfe

W http://en.wikipedia.org/wiki/Ackerman's\_function Go

LS FR Inf Uni mpi AG Kurt mpi MPI mpi Talks DBLP W Wikipedia

## Definition and properties [\[edit\]](#)

The Ackermann function is defined **recursively** for non-negative integers  $m$  and  $n$  as follows:

$$A(m, n) = \begin{cases} n + 1 & \text{if } m = 0 \\ A(m - 1, 1) & \text{if } m > 0 \text{ and } n = 0 \\ A(m - 1, A(m, n - 1)) & \text{if } m > 0 \text{ and } n > 0. \end{cases}$$

The Ackermann function can be calculated by a simple function based directly on the definition:

Fertig

I am not smart enough to understand this easily.

I am not smart enough to understand this easily.

I am not smart enough to come up with proofs  
(or even reproduce proofs) involving the inverse  
Ackermann function

based on this definition.

What do I tell my students ?

What do I tell my students ?

$A(m,n)$  grows veeeeery quickly ....

$\alpha(m,n)$  grows veeeeery slowly ....

What do I tell my students ?

$A(m,n)$  grows veeeeery quickly ....

$\alpha(m,n)$  grows veeeeery slowly ....

Let's move on to the next subject !



Goal of this talk:

## Goal of this talk:

Convince, that  $\alpha()$  is not that complicated after all.

## Goal of this talk:

Convince, that  $\alpha()$  is not that complicated after all.

2 examples,

where  $\alpha()$  arises naturally out of the analysis;

the Ackermann function  $A()$  need not be mentioned;

top-down approach;

## Goal of this talk:

Convince, that  $\alpha()$  is not that complicated after all.

2 examples,

where  $\alpha()$  arises naturally out of the analysis;

the Ackermann function  $A()$  need not be mentioned;

top-down approach;

Partial sum problem  
in the semi-group setting

## Goal of this talk:

Convince, that  $\alpha()$  is not that complicated after all.

2 examples,

where  $\alpha()$  arises naturally out of the analysis;

the Ackermann function  $A()$  need not be mentioned;

top-down approach;

Partial sum problem  
in the semi-group setting

Union Find with  
Path Compression

# Divide-and-Conquer Recurrences, Baby Version

## Divide-and-Conquer Recurrences, Baby Version

Typical Divide-and-Conquer:

If problem set  $S$  has size  $n=1$ , then nothing to be done.

Otherwise:

- \* partition  $S$  into subproblems of size  $< f(n)$
- \* solve each of the  $n/f(n)$  subproblems recursively
- \* combine subsolutions.

## Divide-and-Conquer Recurrences, Baby Version

Typical Divide-and-Conquer:

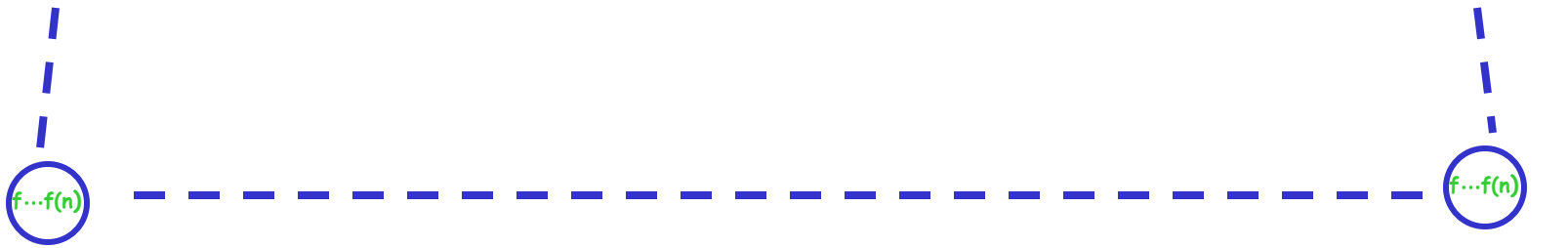
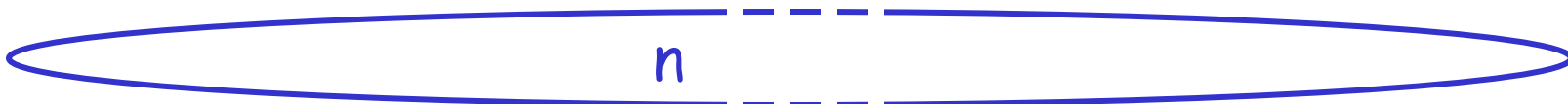
If problem set  $S$  has size  $n=1$ , then nothing to be done.

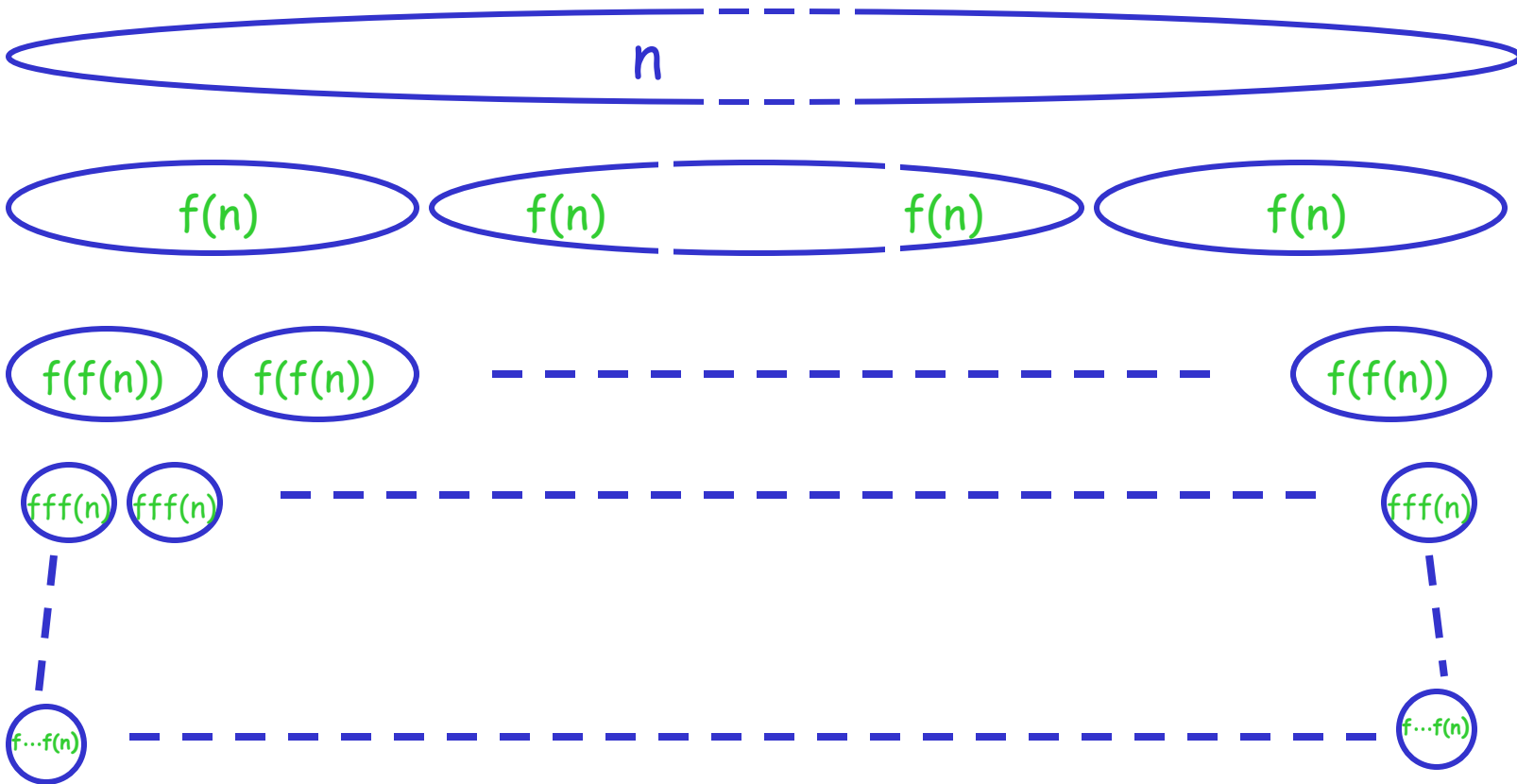
Otherwise:

- \* partition  $S$  into subproblems of size  $< f(n)$
- \* solve each of the  $n/f(n)$  subproblems recursively
- \* combine subsolutions.

(  $f$  needs to satisfy contraction condition  $f(n) < n$  for  $n > 1$ .)

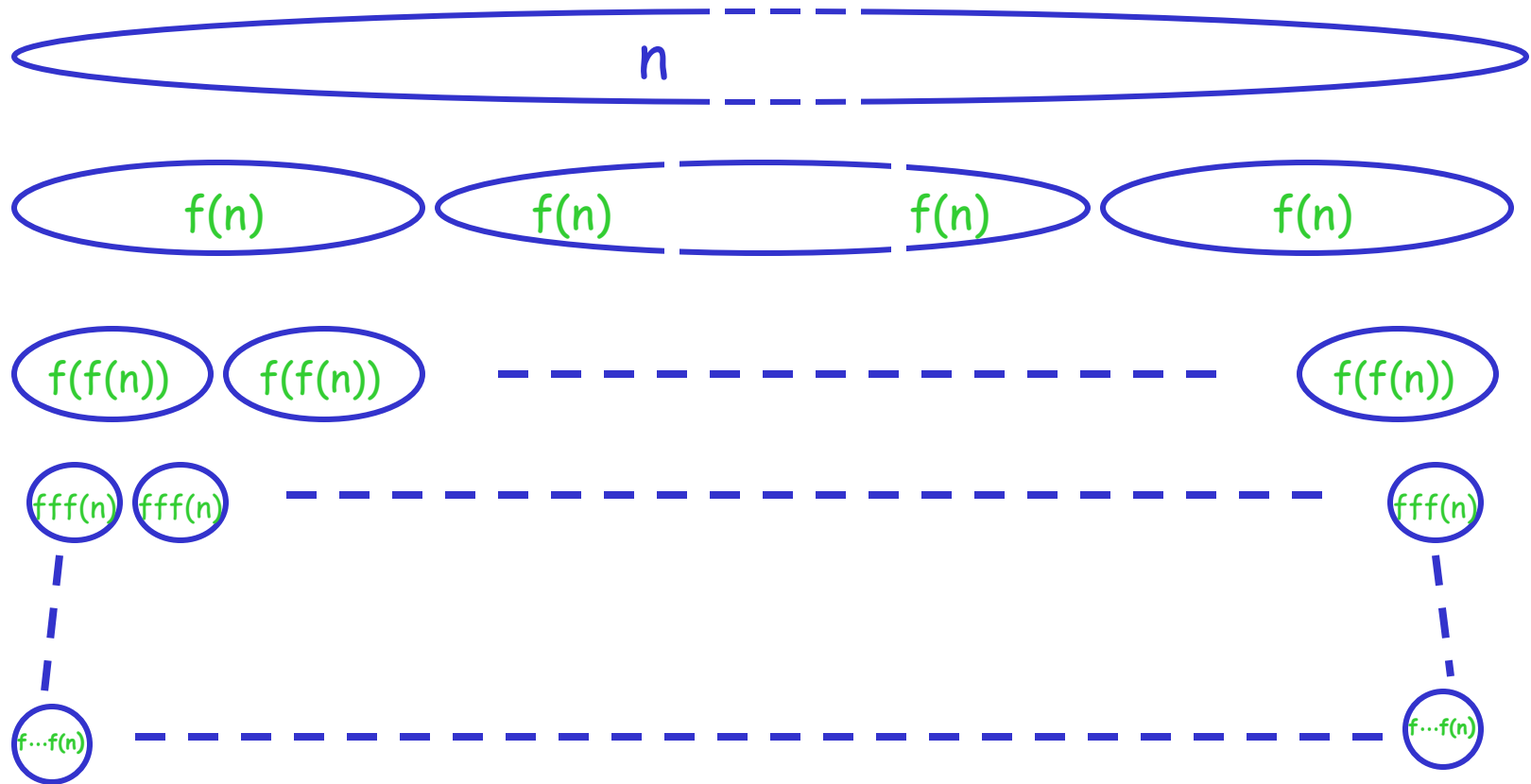






Recurrence:

$$X(n) \leq \begin{cases} 0 & \text{if } n \leq 1 \\ a \cdot n + \frac{n}{f(n)} \cdot X(f(n)) & \text{if } n > 1 \end{cases}$$



Recurrence:

$$X(n) \leq \begin{cases} 0 & \text{if } n \leq 1 \\ a \cdot n + \frac{n}{f(n)} \cdot X(f(n)) & \text{if } n > 1 \end{cases}$$

Solution:  $X(n) \leq a \cdot n \cdot f^*(n)$

$$f^*(n) = \begin{cases} 0 & \text{if } n \leq 1 \\ 1 + f^*(f(n)) & \text{if } n > 1 \end{cases}$$

$$f^*(n) = \begin{cases} 0 & \text{if } n \leq 1 \\ 1 + f^*(f(n)) & \text{if } n > 1 \end{cases}$$

$$f^*(n) = \min \left\{ k \mid \underbrace{f(f(\dots f(n)\dots))}_{k \text{ times}} \leq 1 \right\}$$

$$f^*(n) = \begin{cases} 0 & \text{if } n \leq 1 \\ 1 + f^*(f(n)) & \text{if } n > 1 \end{cases}$$

$$f^*(n) = \min \{ k \mid \underbrace{f(f(\dots f(n)\dots))}_{k \text{ times}} \leq 1 \}$$

- Properties:
- 1)  $f^*(f(n)) = f^*(n) - 1$
  - 2)  $f$  a "nice" compaction  
 $\Rightarrow f^*$  a "nice" compaction and  
 $f^*$  "much smaller" than  $f$

## Examples for $f^*$ :

$f(n)$	$f^*(n)$
$n-1$	$n-1$
$n-2$	$n/2$
$n-c$	$n/c$
$n/2$	$\log_2 n$
$n/c$	$\log_c n$
$\sqrt{n}$	$\log \log n$
$\log n$	$\log^* n$

## Partial sum problem in the semi-group setting

Data:  $A_1, A_2, \dots, A_n \in \text{"Semigroup"} (G, +)$

Query:  $i, j$       Answer:  $A_i + A_{i+1} + \dots + A_j$   
"partial sum"



## Partial sum problem in the semi-group setting

Data:  $A_1, A_2, \dots, A_n \in \text{"Semigroup"} (G, +)$

Query:  $i, j$       Answer:  $A_i + A_{i+1} + \dots + A_j$   
"partial sum"

Goal: Store "few" values of  $G$  so that each query can be answered with little cost

# Partial sum problem in the semi-group setting

Data:  $A_1, A_2, \dots, A_n \in \text{"Semigroup"} (G, +)$

Query:  $i, j$       Answer:  $A_i + A_{i+1} + \dots + A_j$   
"partial sum"

Goal: Store "few" values of  $G$  so that each query can be answered with little cost

# of "+" operations

## Partial sum problem in the semi-group setting

Data:  $A_1, A_2, \dots, A_n \in \text{"Semigroup"} (G, +)$

Query:  $i, j$       Answer:  $A_i + A_{i+1} + \dots + A_j$   
"partial sum"

Goal: Store "few" values of  $G$  so that each query can be answered with little cost

# of "+" operations

$S_k(n)$  = # of values to be stored so that every query can be answered using at most  $k$  "+" operations.

## Partial sum problem in the semi-group setting

Data:  $A_1, A_2, \dots, A_n \in \text{"Semigroup"} (G, +)$

Query:  $i, j$       Answer:  $A_i + A_{i+1} + \dots + A_j$   
"partial sum"

Goal: Store "few" values of  $G$  so that each query can be answered with little cost

# of "+" operations

$S_k(n)$  = # of values to be stored so that every query can be answered using at most  $k$  "+" operations.

$$S_0(n) = \binom{n+1}{2}$$

Example semi-groups  $(G,+)$  :

$(\mathbb{R}, \max)$

$(\mathbb{R}^n, \text{componentwise-max})$

$(d \times d \text{ matrices}, \text{mult})$

Claim:  $S_1(n) =$

**Claim:**  $S_1(n) = n \log_2 n$

Claim:  $S_1(n) = n \log_2 n$

"1-op-structure"

case  $n=1$  : trivial

case  $n \geq 2$  : use recursive construction



A

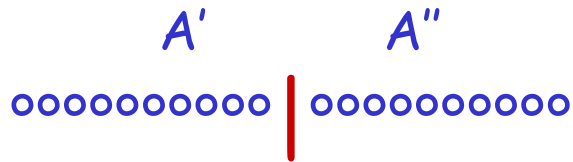
oooooooooooooooooooooooo

A  
oooooooooooooooooooooooo

partition A-sequence into  
2 subsequences A' and A''  
of length  $n/2$  each

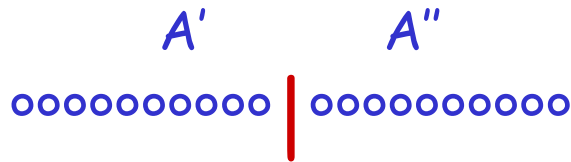


partition  $A$ -sequence into  
2 subsequences  $A'$  and  $A''$   
of length  $n/2$  each





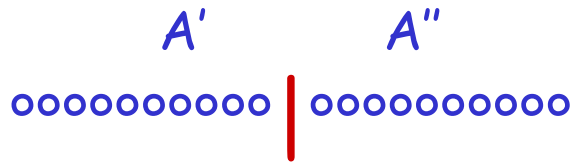
partition  $A$ -sequence into  
2 subsequences  $A'$  and  $A''$   
of length  $n/2$  each



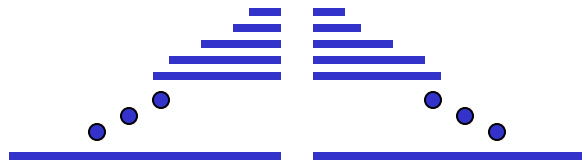
store each suffix-sum of  $A'$   
store each prefix-sum of  $A''$



partition  $A$ -sequence into  
2 subsequences  $A'$  and  $A''$   
of length  $n/2$  each

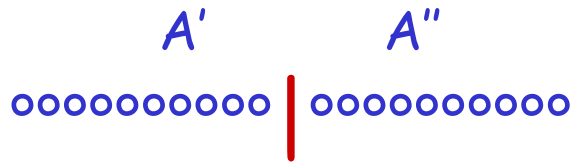


store each suffix-sum of  $A'$   
store each prefix-sum of  $A''$

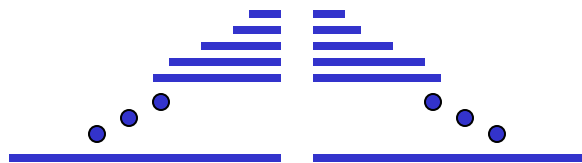




partition  $A$ -sequence into  
2 subsequences  $A'$  and  $A''$   
of length  $n/2$  each



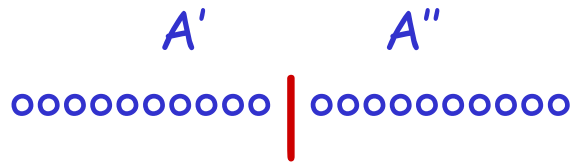
store each suffix-sum of  $A'$   
store each prefix-sum of  $A''$



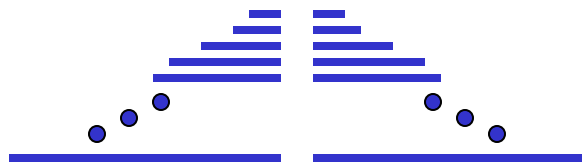
recursively store a  
1-op-structure for  $A'$  and a  
1-op-structure for  $A''$



partition  $A$ -sequence into  
2 subsequences  $A'$  and  $A''$   
of length  $n/2$  each



store each suffix-sum of  $A'$   
store each prefix-sum of  $A''$



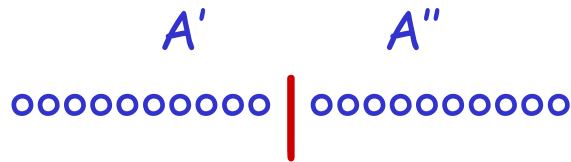
recursively store a  
1-op-structure for  $A'$  and a  
1-op-structure for  $A''$

### Query answering:

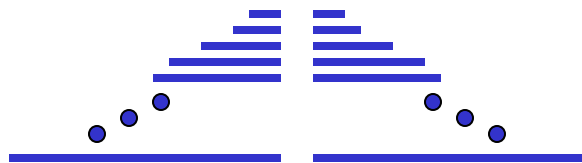
either return (suffix-sum)+(prefix-sum)  
or use one of the recursive structures



partition  $A$ -sequence into  
2 subsequences  $A'$  and  $A''$   
of length  $n/2$  each



store each suffix-sum of  $A'$   
store each prefix-sum of  $A''$



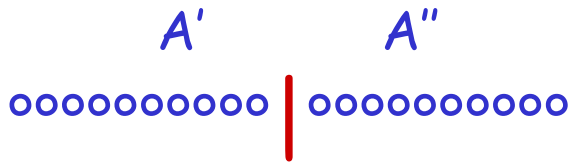
recursively store a  
1-op-structure for  $A'$  and a  
1-op-structure for  $A''$

$$S_1(n) \leq n + \frac{n}{(n/2)} S_1(n/2)$$

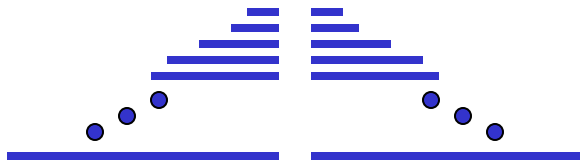




partition  $A$ -sequence into  
2 subsequences  $A'$  and  $A''$   
of length  $n/2$  each



store each suffix-sum of  $A'$   
store each prefix-sum of  $A''$



recursively store a  
1-op-structure for  $A'$  and a  
1-op-structure for  $A''$

$$S_1(n) \leq n + \frac{n}{(n/2)} S_1(n/2)$$

$$\Rightarrow S_1(n) \leq n \cdot (n/2)^* = n \log_2 n$$

$$S_3(n) = ?$$

$$S_3(n) = ?$$

"3-op-structure"

case  $n \leq 4$  : trivial

case  $n \geq 5$  : use recursive construction

A



A

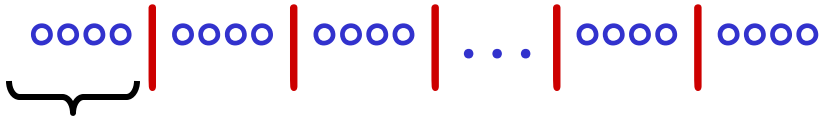


partition A-sequence into  
 $n/\log n$  subsequences of length  
 $\leq \log n$  each

A

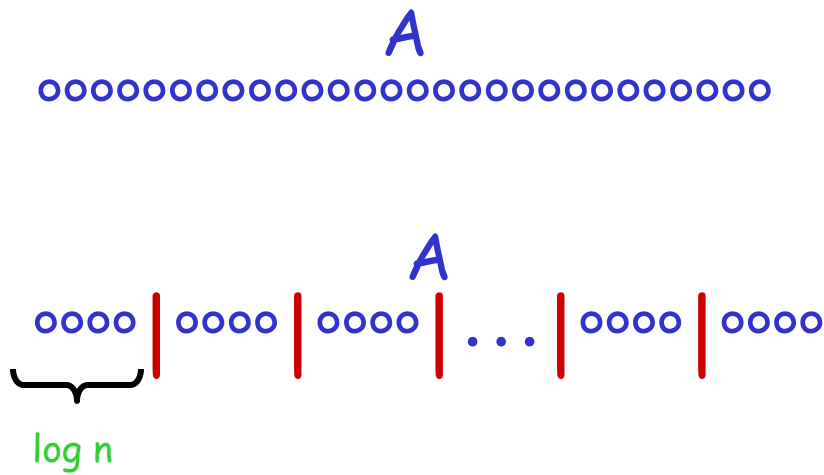


A



$\log n$

partition A-sequence into  
 $n/\log n$  subsequences of length  
 $\leq \log n$  each



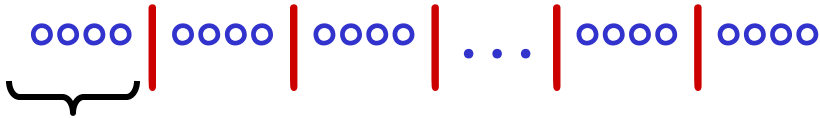
partition  $A$ -sequence into  $n/\log n$  subsequences of length  $\leq \log n$  each

store all prefix- and all suffix-sums within each subsequence

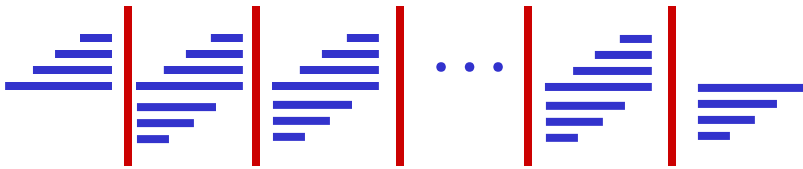
A



A



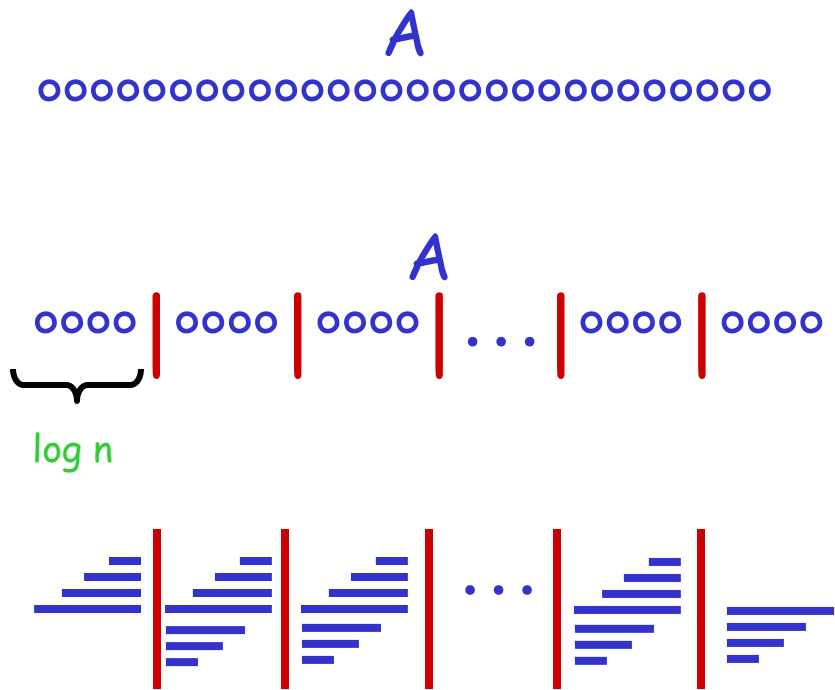
log n



partition A-sequence into  $n/\log n$  subsequences of length  $\leq \log n$  each

store all prefix- and all suffix-sums within each subsequence

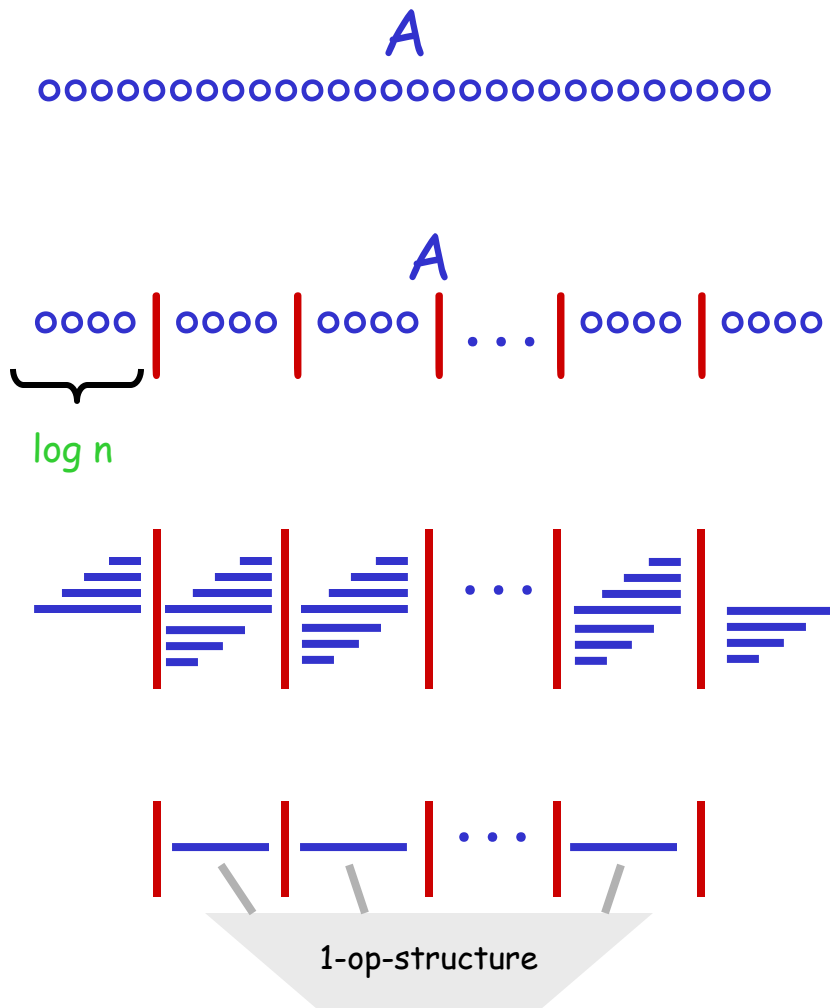




partition  $A$ -sequence into  $n/\log n$  subsequences of length  $\leq \log n$  each

store all prefix- and all suffix-sums within each subsequence

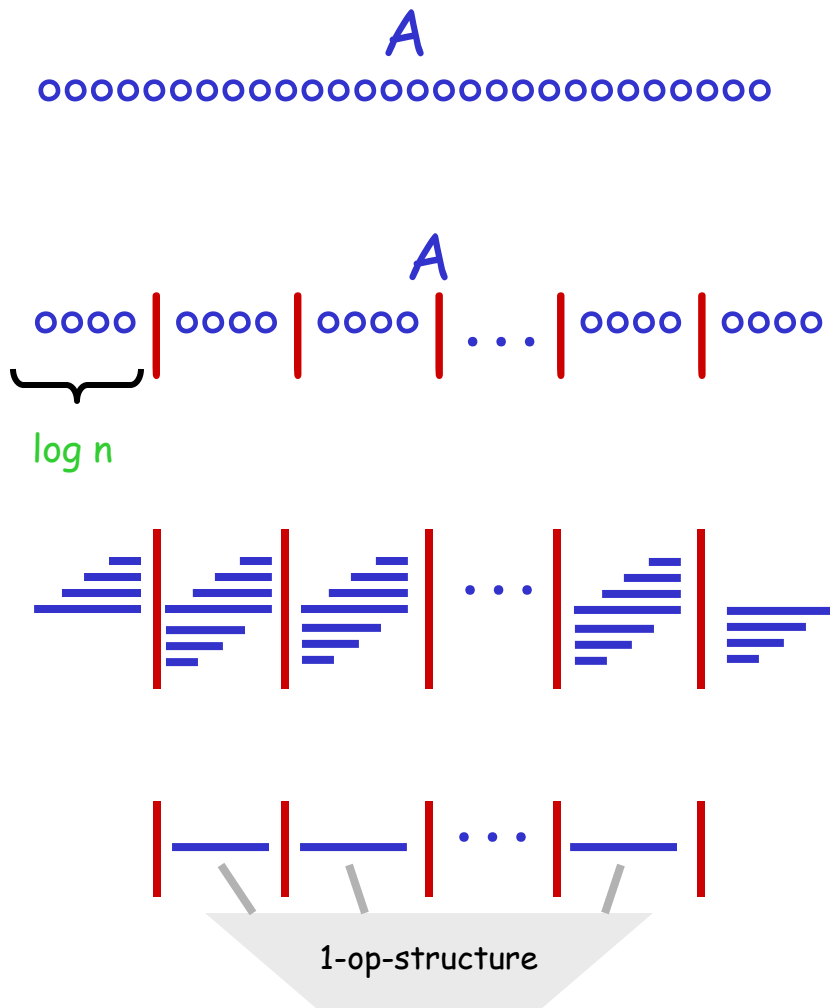
build a 1-op-structure for the  $n/\log n$  subsequence-sums



partition  $A$ -sequence into  $n/\log n$  subsequences of length  $\leq \log n$  each

store all prefix- and all suffix-sums within each subsequence

build a 1-op-structure for the  $n/\log n$  subsequence-sums

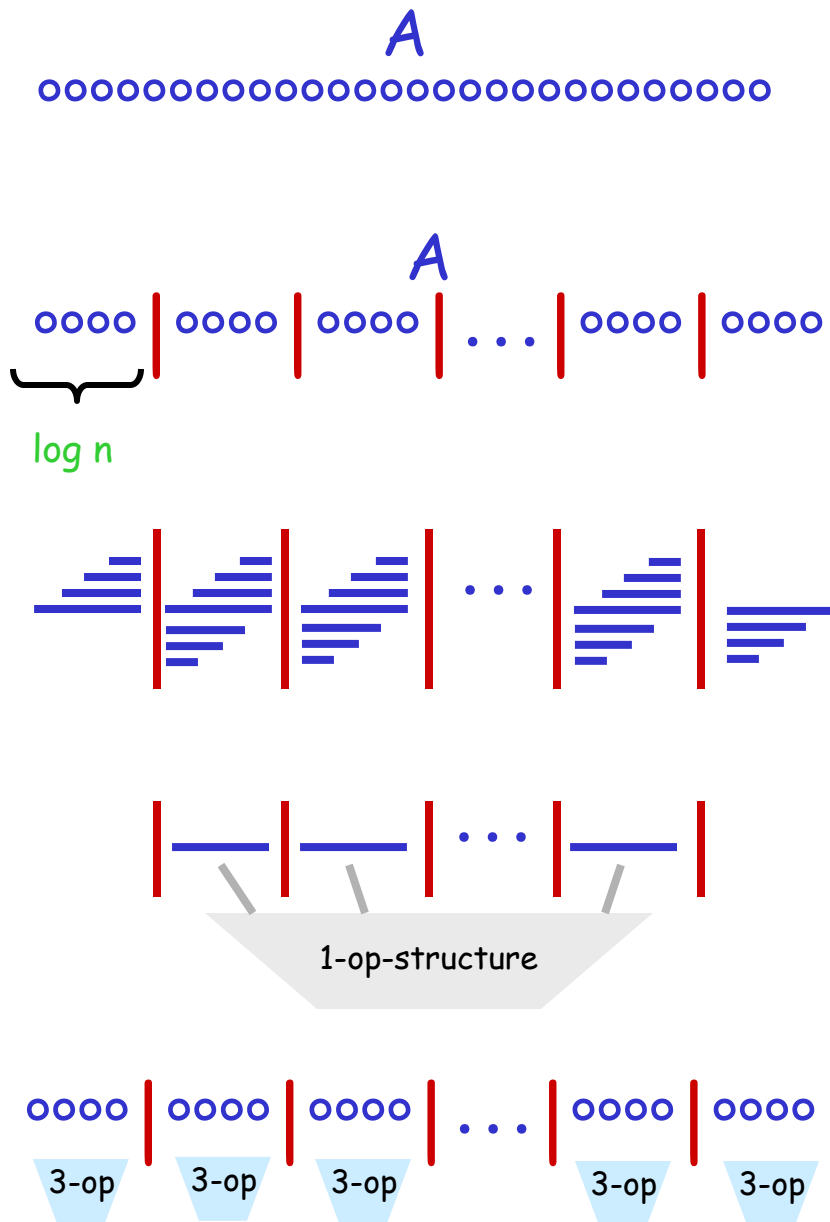


partition  $A$ -sequence into  $n/\log n$  subsequences of length  $\leq \log n$  each

store all prefix- and all suffix-sums within each subsequence

build a 1-op-structure for the  $n/\log n$  subsequence-sums

recursively build a 3-op-structure for each of the  $n/\log n$  subsequences

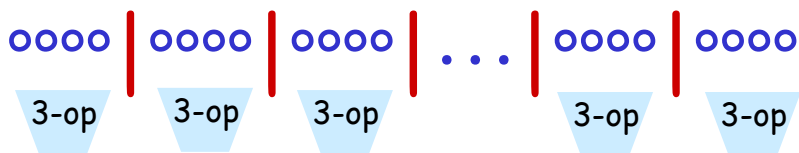
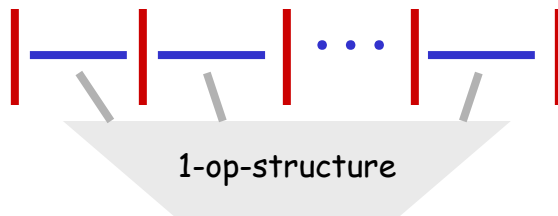
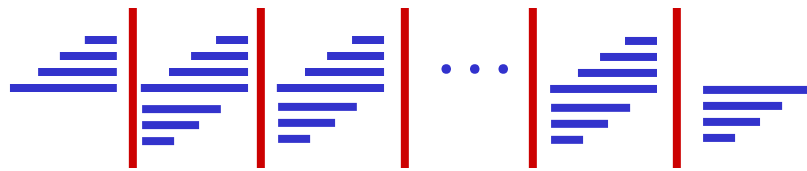
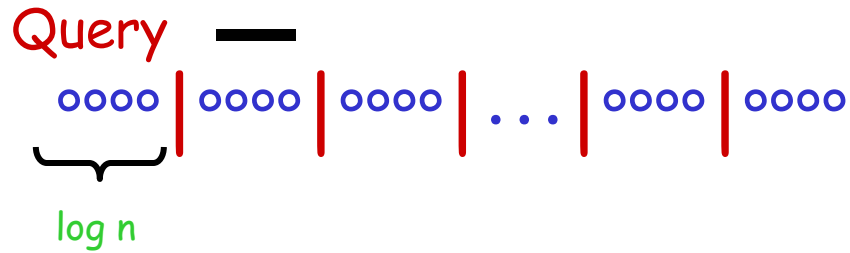


partition  $A$ -sequence into  $n/\log n$  subsequences of length  $\leq \log n$  each

store all prefix- and all suffix-sums within each subsequence

build a 1-op-structure for the  $n/\log n$  subsequence-sums

recursively build a 3-op-structure for each of the  $n/\log n$  subsequences



store all prefix- and all suffix-sums within each subsequence

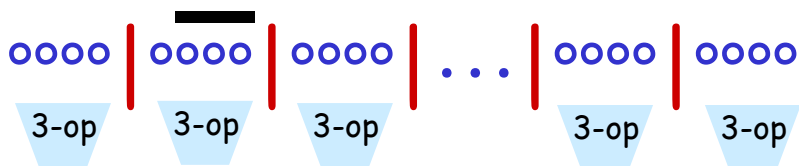
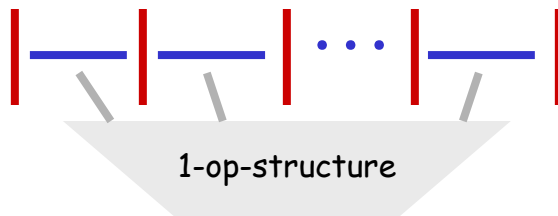
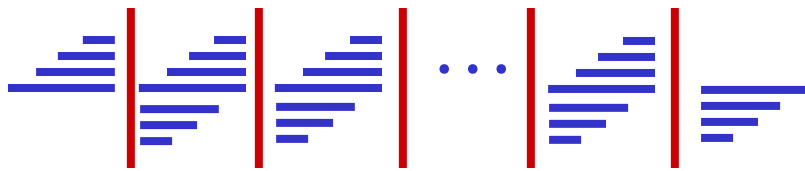
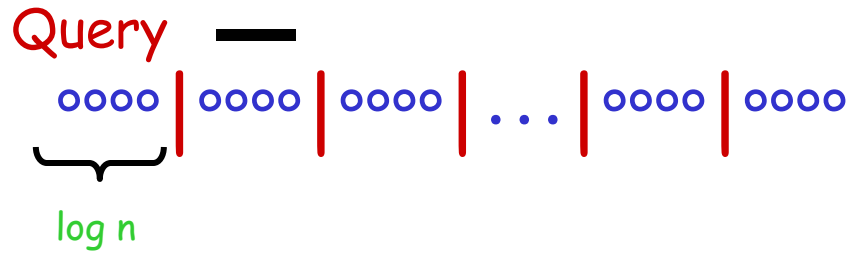
build a 1-op-structure for the  $n/\log n$  subsequence-sums

recursively build a 3-op-structure for each of the  $n/\log n$  subsequences

Query answering:

either use one of the recursive 3-op-structures

or return (suffix-sum)+(answer from 1-op-structure)+(prefix-sum)



store all prefix- and all suffix-sums within each subsequence

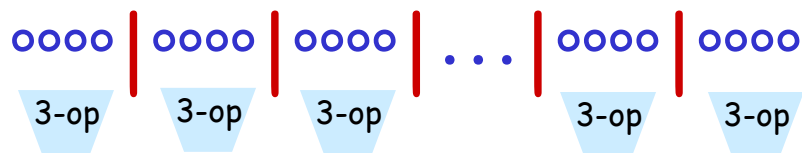
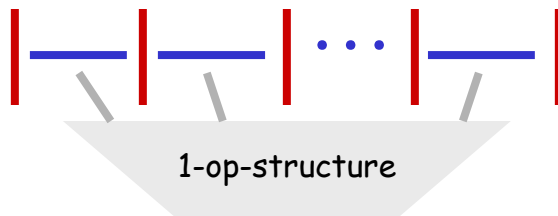
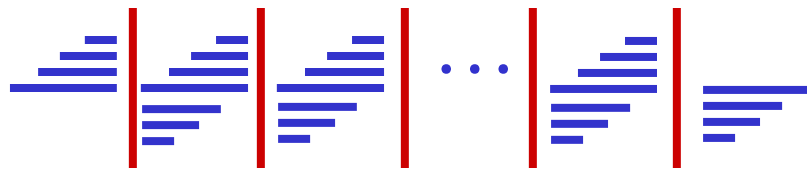
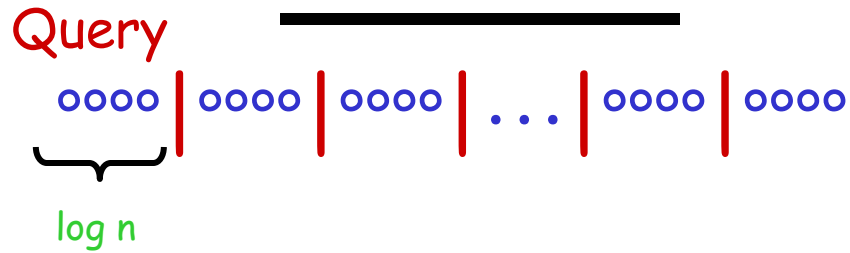
build a 1-op-structure for the  $n/\log n$  subsequence-sums

recursively build a 3-op-structure for each of the  $n/\log n$  subsequences

Query answering:

either use one of the recursive 3-op-structures

or return (suffix-sum)+(answer from 1-op-structure)+(prefix-sum)



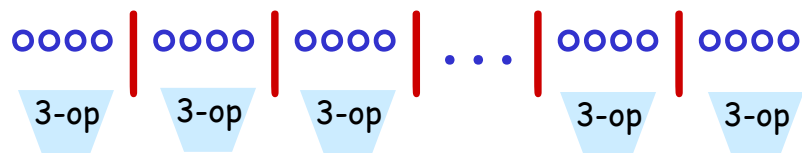
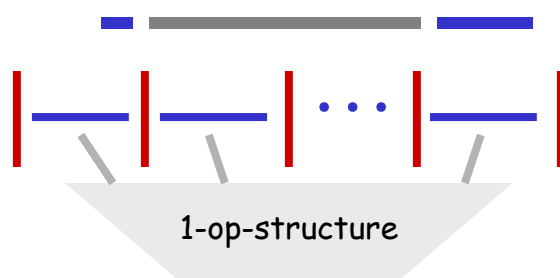
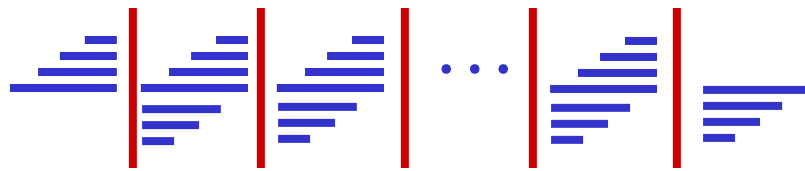
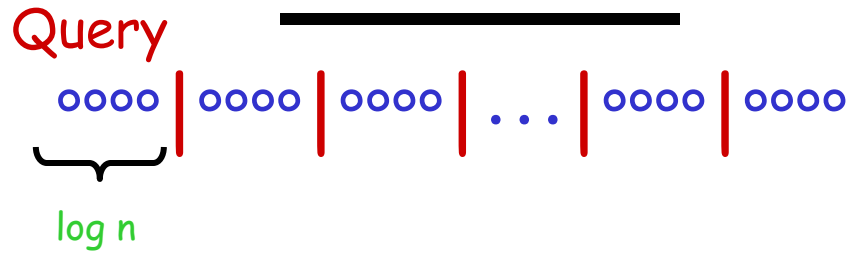
store all prefix- and all suffix-sums within each subsequence

build a 1-op-structure for the  $n/\log n$  subsequence-sums

recursively build a 3-op-structure for each of the  $n/\log n$  subsequences

### Query answering:

either use one of the recursive 3-op-structures  
 or return (suffix-sum)+(answer from 1-op-structure)+(prefix-sum)



store all prefix- and all suffix-sums within each subsequence

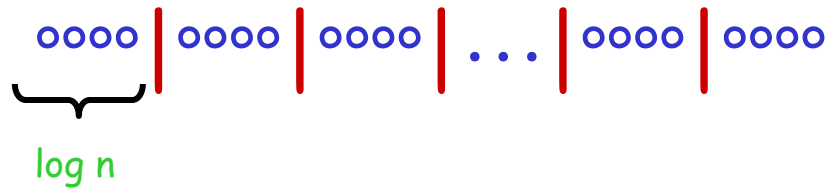
build a 1-op-structure for the  $n/\log n$  subsequence-sums

recursively build a 3-op-structure for each of the  $n/\log n$  subsequences

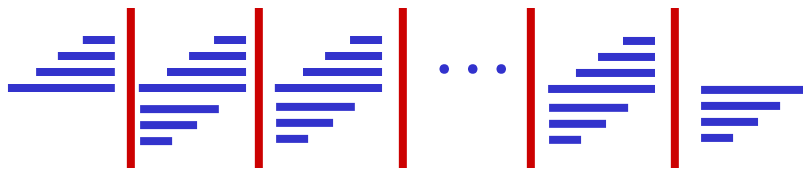
### Query answering:

either use one of the recursive 3-op-structures  
 or return (suffix-sum)+(answer from 1-op-structure)+(prefix-sum)

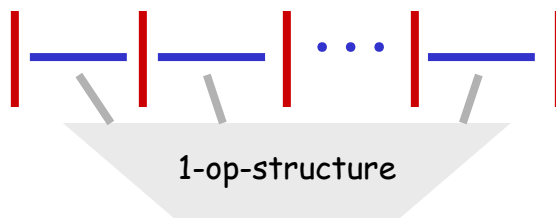




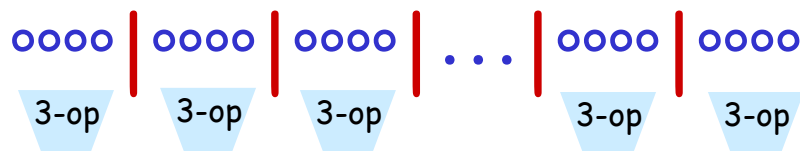
store all prefix- and all suffix-sums within each subsequence



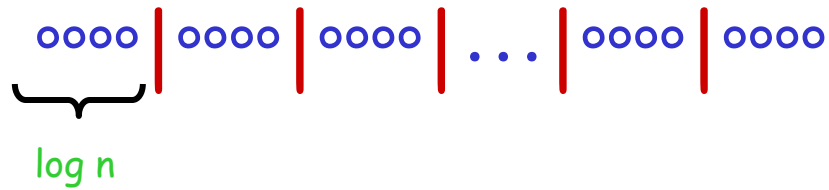
build a 1-op-structure for the  $n/\log n$  subsequence-sums



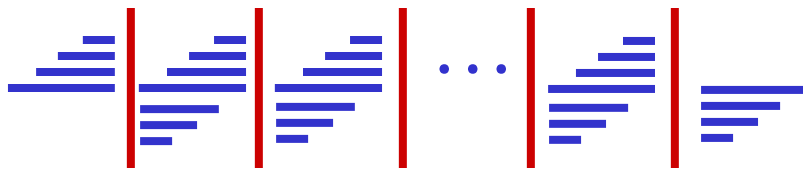
recursively build a 3-op-structure for each of the  $n/\log n$  subsequences



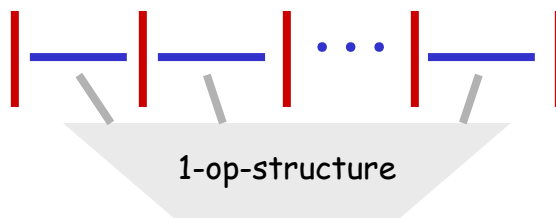
$$S_3(n) \leq 2n + S_1\left(\frac{n}{\log n}\right) + \frac{n}{\log n} \cdot S_3(\log n)$$



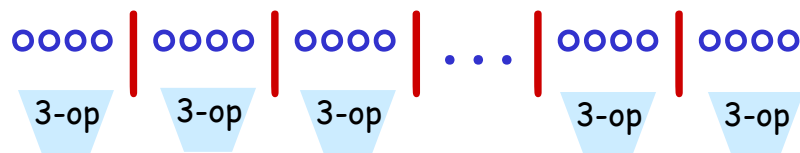
store all prefix- and all suffix-sums within each subsequence



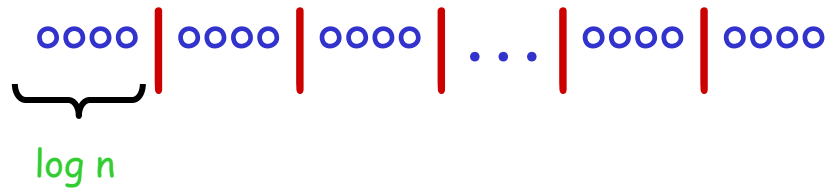
build a 1-op-structure for the  $n/\log n$  subsequence-sums



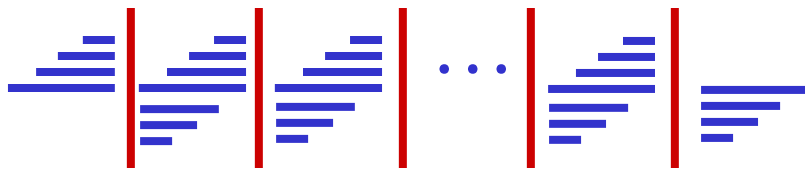
recursively build a 3-op-structure for each of the  $n/\log n$  subsequences



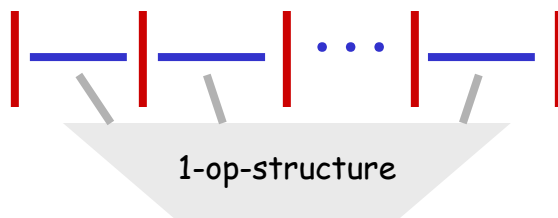
$$S_3(n) \leq 2n + \underbrace{S_1\left(\frac{n}{\log n}\right)}_{\leq n} + \frac{n}{\log n} \cdot S_3(\log n)$$



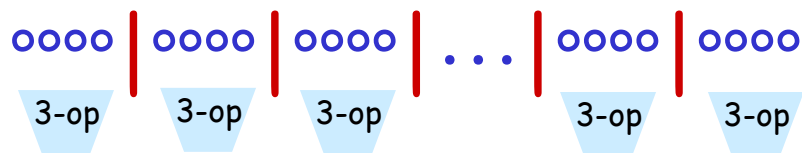
store all prefix- and all suffix-sums within each subsequence



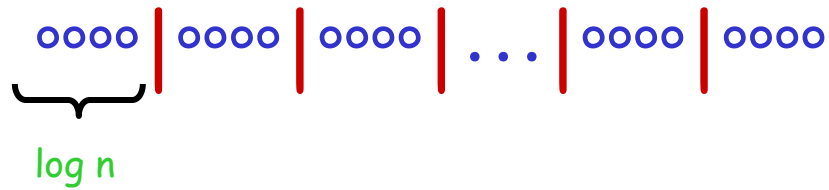
build a 1-op-structure for the  $n/\log n$  subsequence-sums



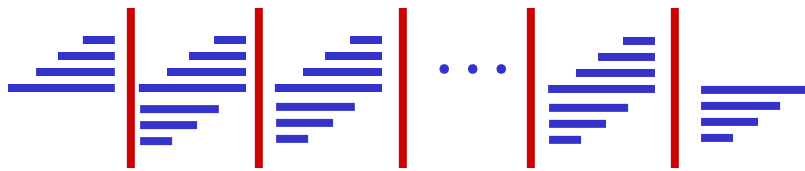
recursively build a 3-op-structure for each of the  $n/\log n$  subsequences



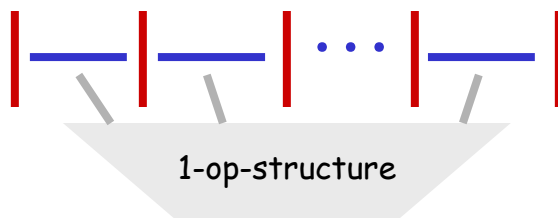
$$S_3(n) \leq 2n + \underbrace{S_1\left(\frac{n}{\log n}\right)}_{\leq n} + \frac{n}{\log n} \cdot S_3(\log n) \leq 3n + \frac{n}{\log n} \cdot S_3(\log n)$$



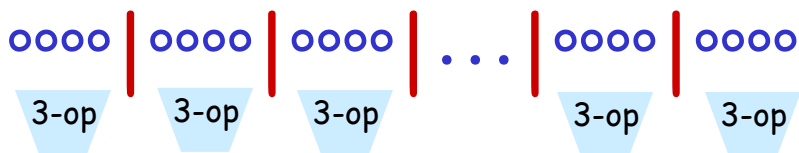
store all prefix- and all suffix-sums within each subsequence



build a 1-op-structure for the  $n/\log n$  subsequence-sums



recursively build a 3-op-structure for each of the  $n/\log n$  subsequences



$$S_3(n) \leq 2n + \underbrace{S_1\left(\frac{n}{\log n}\right)}_{\leq n} + \frac{n}{\log n} \cdot S_3(\log n) \leq 3n + \frac{n}{\log n} \cdot S_3(\log n)$$

$\Rightarrow S_3(n) \leq 3n \log^* n$

$$S_5(n) = ? \quad S_7(n) = ? \quad S_9(n) = ?$$

$$S_{2k+1}(n) = ?$$

$$S_5(n) = ? \quad S_7(n) = ? \quad S_9(n) = ?$$

$$S_{2k+1}(n) = ?$$

**Assume:**  $S_{2k-1}(n) \leq (2k-1) \cdot n \cdot f(n)$

realized by  $(2k-1)$ -op-structure

$$S_5(n) = ? \quad S_7(n) = ? \quad S_9(n) = ?$$

$$S_{2k+1}(n) = ?$$

**Assume:**  $S_{2k-1}(n) \leq (2k-1) \cdot n \cdot f(n)$

realized by  $(2k-1)$ -op-structure

**Show:**  $S_{2k+1}(n) \leq (2k+1) \cdot n \cdot f^*(n)$

"(2k+1)-op-structure"

case  $n \leq 2k+2$  : trivial

case  $n \geq 2k+3$  : use recursive construction



A



A



partition A-sequence into  
 $n/f(n)$  subsequences of length  
 $\leq f(n)$  each

A

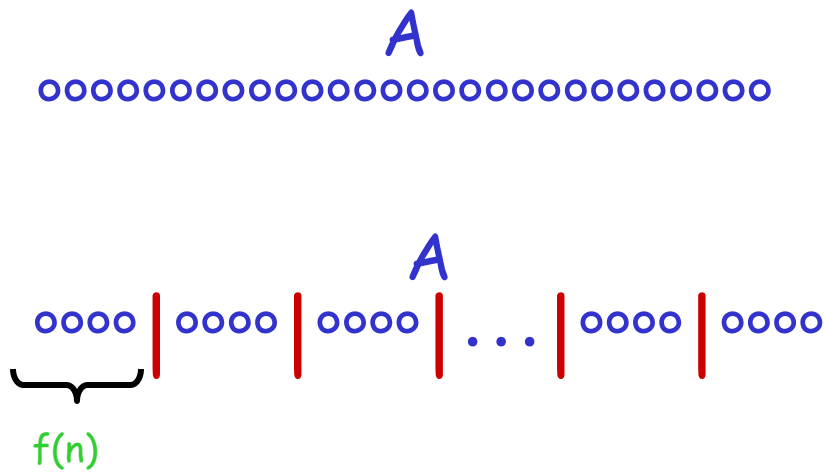
oooooooooooooooooooooooooooooooooooo

partition A-sequence into  
 $n/f(n)$  subsequences of length  
 $\leq f(n)$  each

A

oooo | oooo | oooo | ... | oooo | oooo

f(n)



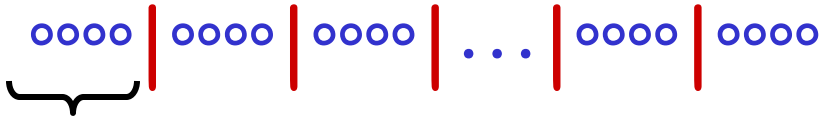
partition  $A$ -sequence into  $n/f(n)$  subsequences of length  $\leq f(n)$  each

store all prefix- and all suffix-sums within each subsequence

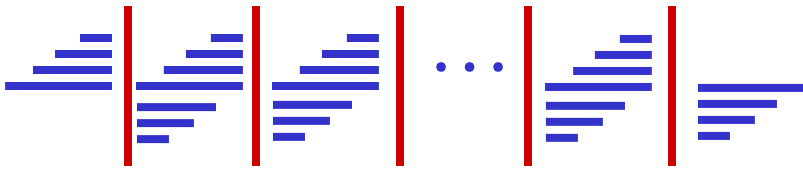
A



A

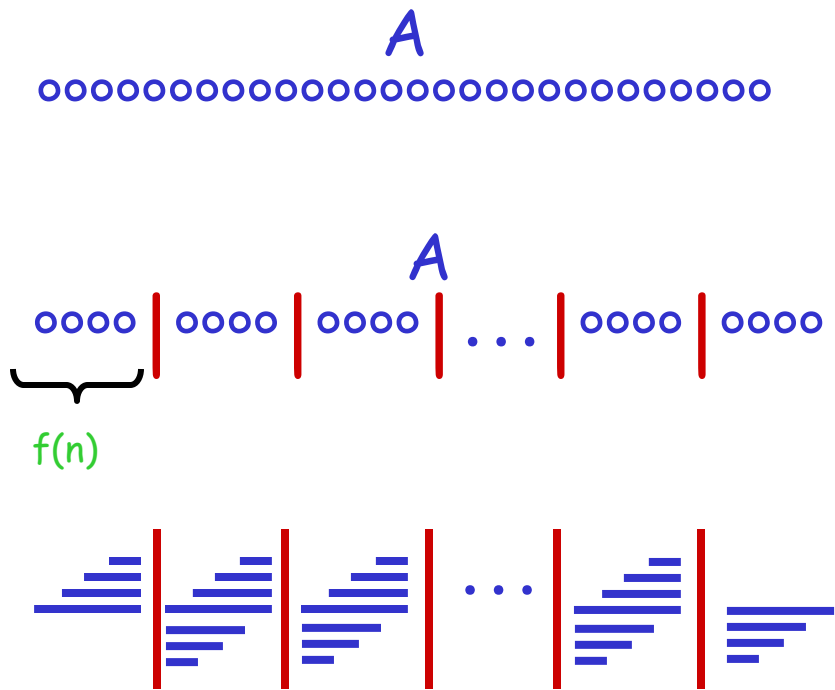


f(n)



partition A-sequence into  $n/f(n)$  subsequences of length  $\leq f(n)$  each

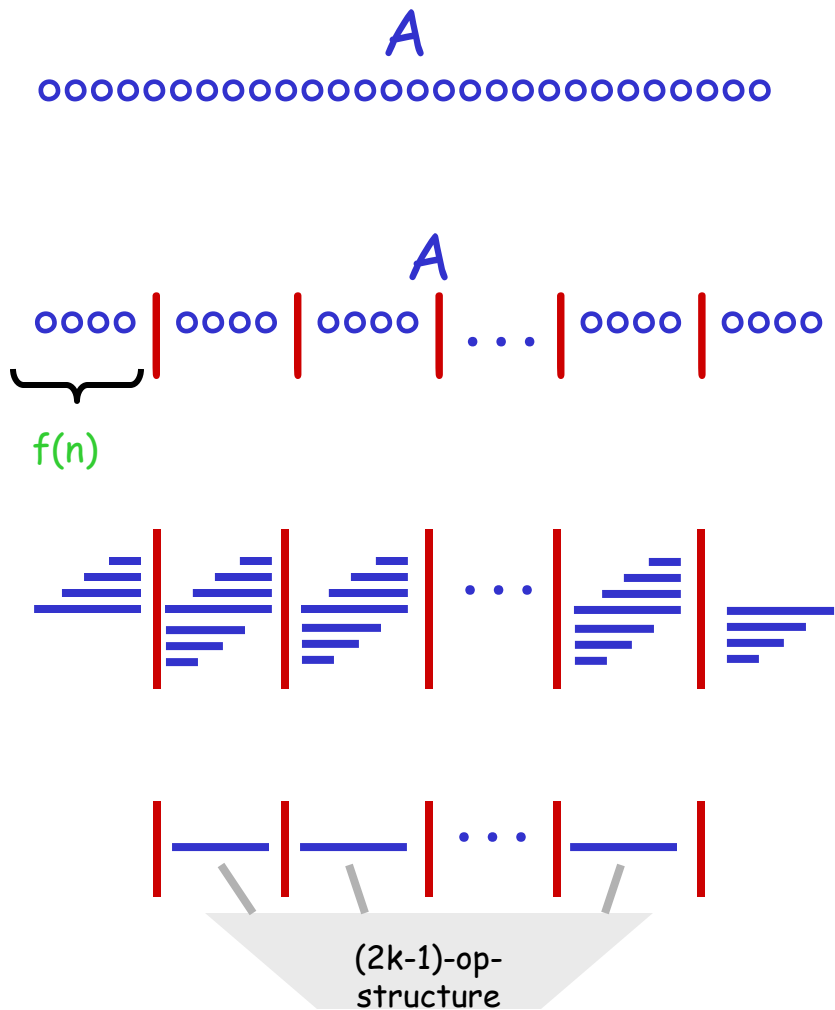
store all prefix- and all suffix-sums within each subsequence



partition  $A$ -sequence into  $n/f(n)$  subsequences of length  $\leq f(n)$  each

store all prefix- and all suffix-sums within each subsequence

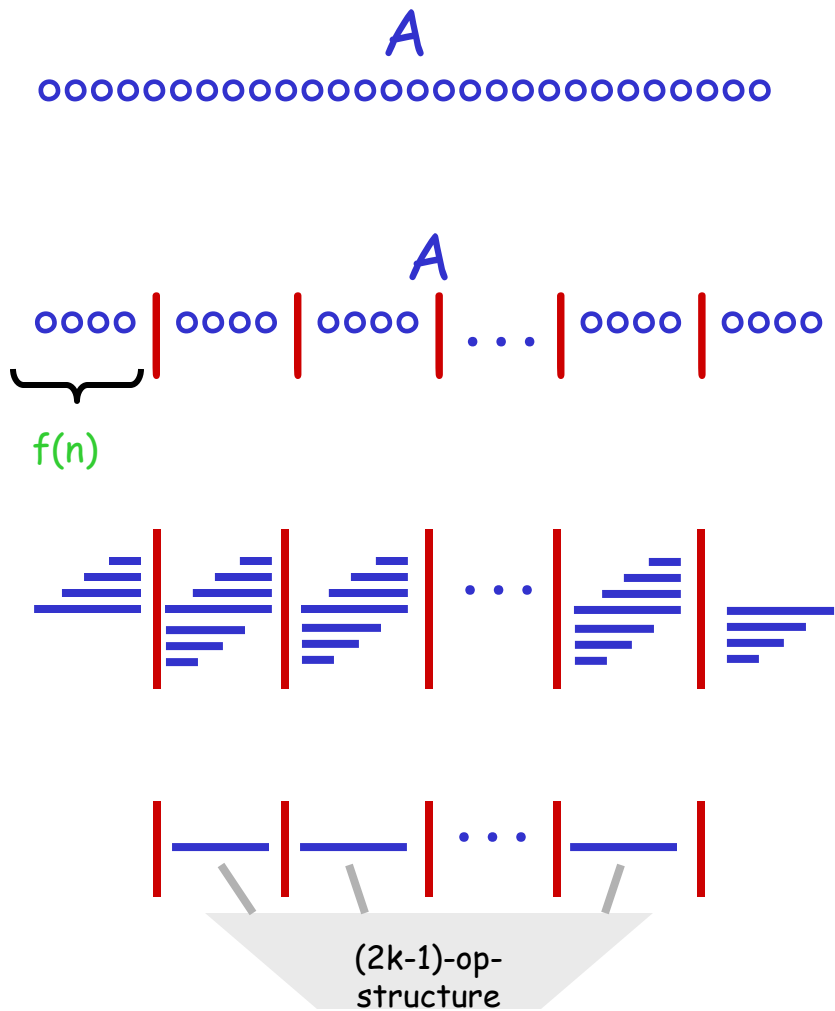
build a  $(2k-1)$ -op-structure for the  $n/f(n)$  subsequence-sums



partition  $A$ -sequence into  $n/f(n)$  subsequences of length  $\leq f(n)$  each

store all prefix- and all suffix-sums within each subsequence

build a  $(2k-1)$ -op-structure for the  $n/f(n)$  subsequence-sums



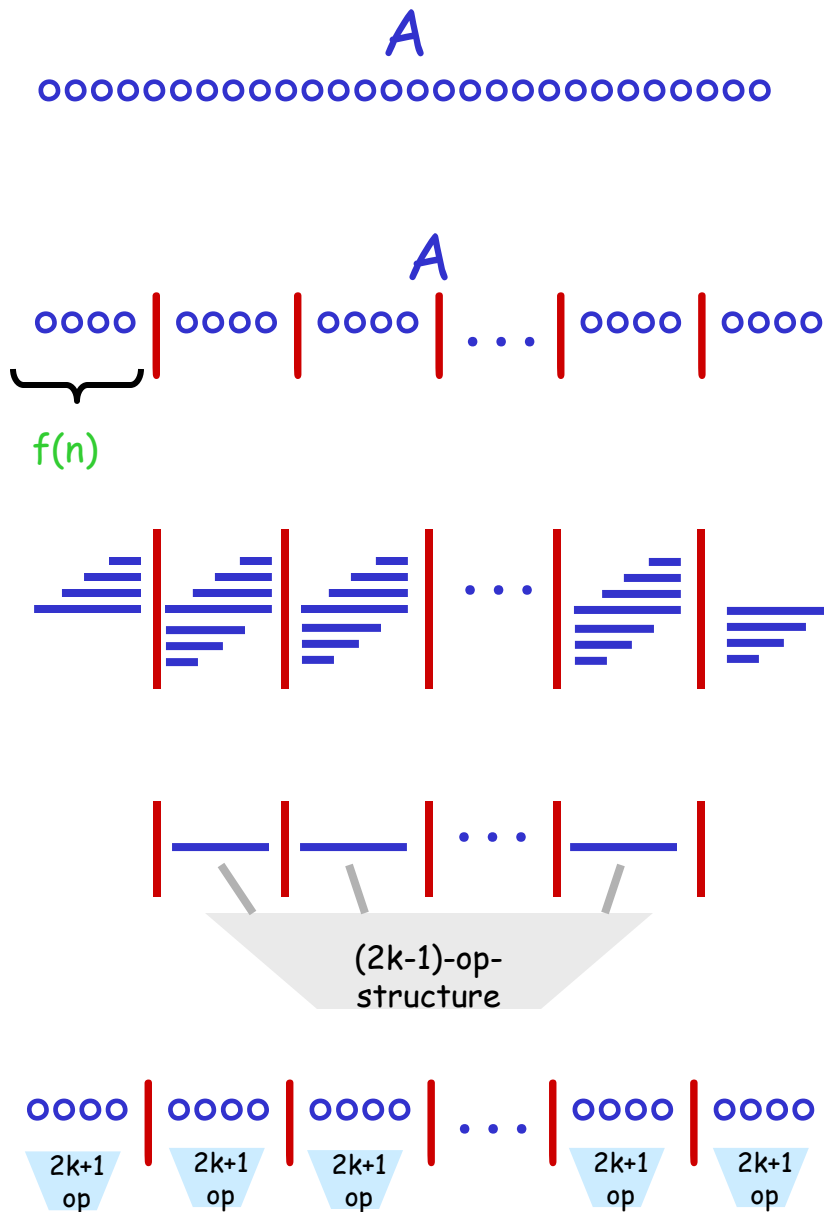
partition  $A$ -sequence into  $n/f(n)$  subsequences of length  $\leq f(n)$  each

store all prefix- and all suffix-sums within each subsequence

build a  $(2k-1)$ -op-structure for the  $n/f(n)$  subsequence-sums

recursively build a  $(2k+1)$ -op-structure for each of the  $n/f(n)$  subsequences



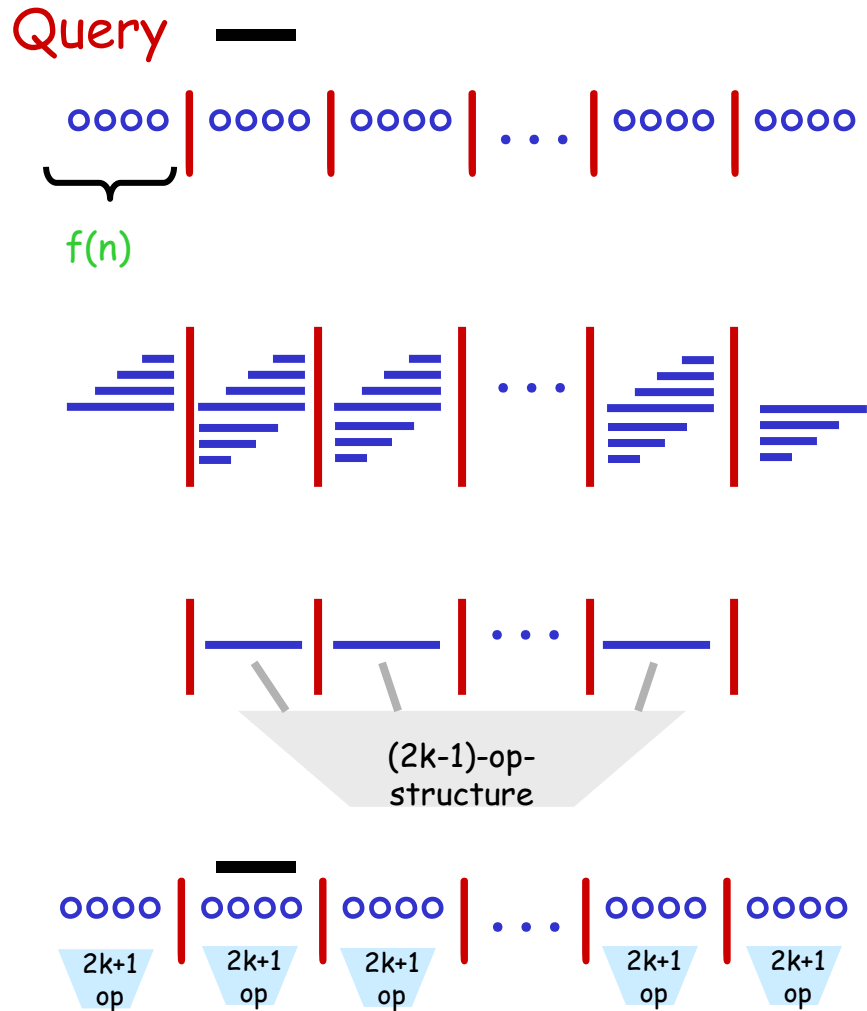


partition  $A$ -sequence into  $n/f(n)$  subsequences of length  $\leq f(n)$  each

store all prefix- and all suffix-sums within each subsequence

build a  $(2k-1)$ -op-structure for the  $n/f(n)$  subsequence-sums

recursively build a  $(2k+1)$ -op-structure for each of the  $n/f(n)$  subsequences



store all prefix- and all suffix-sums within each subsequence

build a  $(2k-1)$ -op-structure for the  $n/f(n)$  subsequence-sums

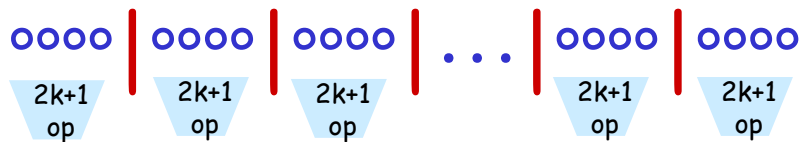
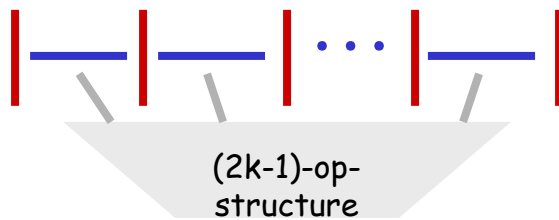
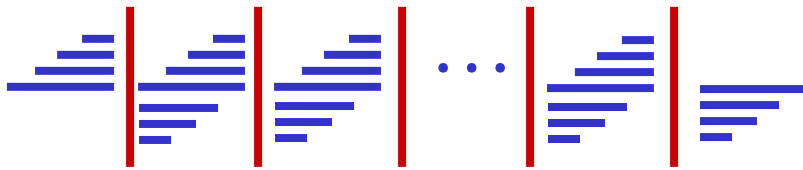
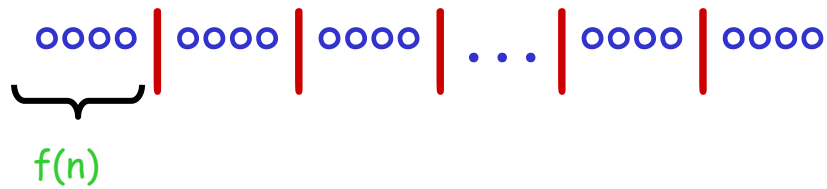
recursively build a  $(2k+1)$ -op-structure for each of the  $n/f(n)$  subsequences

Query answering:

either use one of the recursive  $(2k+1)$ -op-structures

or return (suffix-sum)+(answer from  $(2k-1)$ -op-structure)+(prefix-sum)

## Query



store all prefix- and all suffix-sums within each subsequence

build a  $(2k-1)$ -op-structure for the  $n/f(n)$  subsequence-sums

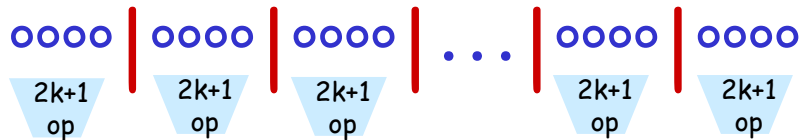
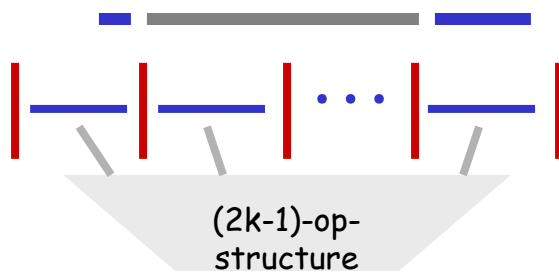
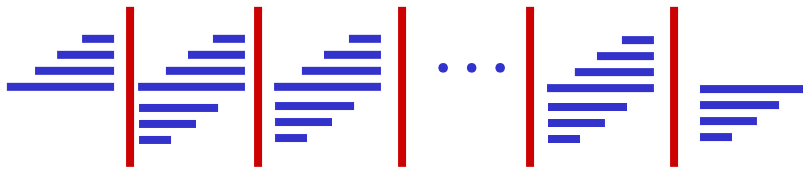
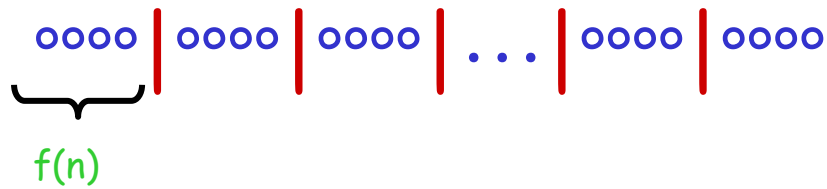
recursively build a  $(2k+1)$ -op-structure for each of the  $n/f(n)$  subsequences

## Query answering:

either use one of the recursive  $(2k+1)$ -op-structures

or return  $(\text{suffix-sum}) + (\text{answer from } (2k-1)\text{-op-structure}) + (\text{prefix-sum})$

## Query



store all prefix- and all suffix-sums within each subsequence

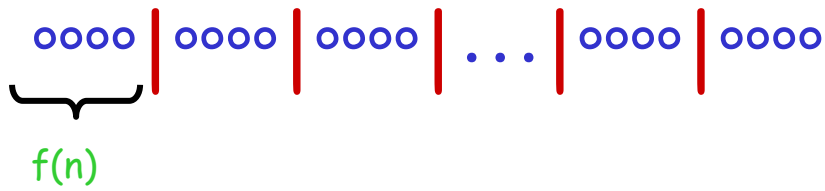
build a  $(2k-1)$ -op-structure for the  $n/f(n)$  subsequence-sums

recursively build a  $(2k+1)$ -op-structure for each of the  $n/f(n)$  subsequences

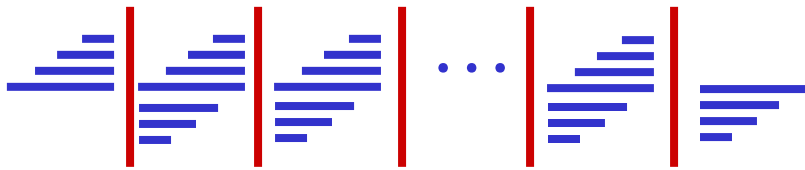
## Query answering:

either use one of the recursive  $(2k+1)$ -op-structures

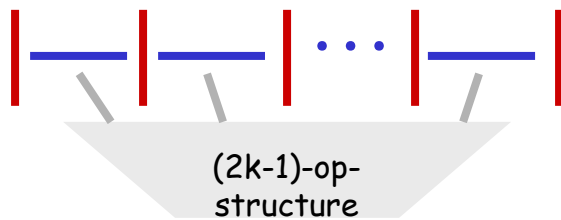
or return  $(\text{suffix-sum}) + (\text{answer from } (2k-1)\text{-op-structure}) + (\text{prefix-sum})$



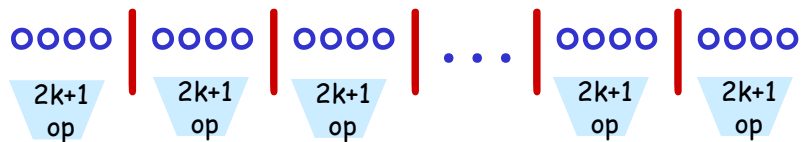
store all prefix- and all suffix-sums within each subsequence



build a  $(2k-1)$ -op-structure for the  $n/f(n)$  subsequence-sums



recursively build a  $(2k+1)$ -op-structure for each of the  $n/f(n)$  subsequences



$$S_{2k+1}(n) \leq 2n + S_{2k-1}\left(\frac{n}{f(n)}\right) + \frac{n}{f(n)} \cdot S_{2k+1}(f(n))$$

$$S_{2k+1}(n) \leq 2n + \underbrace{S_{2k-1}\left(\frac{n}{f(n)}\right)} + \frac{n}{f(n)} \cdot S_{2k+1}(f(n))$$

$$\leq (2k-1) \frac{n}{f(n)} \cdot f\left(\frac{n}{f(n)}\right)$$

$$S_{2k+1}(n) \leq 2n + \underbrace{S_{2k-1}\left(\frac{n}{f(n)}\right)} + \frac{n}{f(n)} \cdot S_{2k+1}(f(n))$$

$$\leq (2k-1) \frac{n}{f(n)} \cdot f\left(\frac{n}{f(n)}\right)$$

$$S_{2k+1}(n) \leq 2n + \underbrace{S_{2k-1}\left(\frac{n}{f(n)}\right)} + \frac{n}{f(n)} \cdot S_{2k+1}(f(n))$$

$$\leq (2k-1) \frac{n}{f(n)} \cdot f\left(\frac{n}{f(n)}\right)$$

$$S_{2k+1}(n) \leq (2k+1) \cdot n + \frac{n}{f(n)} \cdot S_{2k+1}(f(n))$$



$$S_{2k+1}(n) \leq 2n + \underbrace{S_{2k-1}\left(\frac{n}{f(n)}\right)} + \frac{n}{f(n)} \cdot S_{2k+1}(f(n))$$

$$\leq (2k-1) \frac{n}{f(n)} \cdot f\left(\frac{n}{f(n)}\right)$$

$$S_{2k+1}(n) \leq (2k+1) \cdot n + \frac{n}{f(n)} \cdot S_{2k+1}(f(n))$$

$$\Rightarrow S_{2k+1}(n) \leq (2k+1)n f^*(n)$$

$$k=1 : S_1(n) \leq n \log n$$

$$\text{For all } k > 1 : S_{2k-1}(n) \leq (2k-1) \cdot n \cdot f(n)$$

$$\Rightarrow S_{2k+1}(n) \leq (2k+1) \cdot n \cdot f^*(n)$$

$$k=1 : S_1(n) \leq n \log n$$

$$\text{For all } k > 1 : S_{2^{k-1}}(n) \leq (2^{k-1}) \cdot n \cdot f(n)$$

$$\Rightarrow S_{2^k}(n) \leq (2^k) \cdot n \cdot f^*(n)$$

$$\text{For all } k \geq 1 : S_{2^k}(n) \leq (2^k) \cdot n \cdot \log^{\overbrace{** \dots *}}^{k \text{ times}}(n)$$

For all  $k \geq 1$  :  $S_{2k+1} \leq (2k+1) \cdot n \cdot \log^{\overbrace{**\dots*}^{k \text{ times}}}(n)$

For all  $k \geq 1$  :  $S_{2k+1} \leq (2k+1) \cdot n \cdot \log^{\overbrace{** \dots *}}^{k \text{ times}}(n)$

Define  $\alpha(n) = \min\{ k \mid \log^{\overbrace{** \dots *}}^{k \text{ times}}(n) \leq 2 \}$

$$\text{For all } k \geq 1 : \quad S_{2k+1} \leq (2k+1) \cdot n \cdot \log^{\overbrace{** \dots *}}^{k \text{ times}}(n)$$

$$\text{Define } \alpha(n) = \min\{ k \mid \log^{\overbrace{** \dots *}}^{k \text{ times}}(n) \leq 2 \}$$

$$\text{For } k = \alpha(n) : \quad S_{2\alpha(n)+1} \leq (2\alpha(n)+1) \cdot n \cdot 2 \\ = O(\alpha(n) \cdot n)$$

$$\text{For all } k \geq 1 : \quad S_{2k+1} \leq (2k+1) \cdot n \cdot \log^{\overbrace{** \dots *}}^{k \text{ times}}(n)$$

$$\text{Define } \alpha(n) = \min\{ k \mid \log^{\overbrace{** \dots *}}^{k \text{ times}}(n) \leq 2 \}$$

$$\text{For } k = \alpha(n) : \quad S_{2\alpha(n)+1} \leq (2\alpha(n)+1) \cdot n \cdot 2 \\ = O(\alpha(n) \cdot n)$$

For  $O(\alpha(n))$  query cost, space  $O(\alpha(n) \cdot n)$  suffices.

**Exercise:**

For  $O(\alpha(n))$  query cost, space  $O(n)$  suffices.

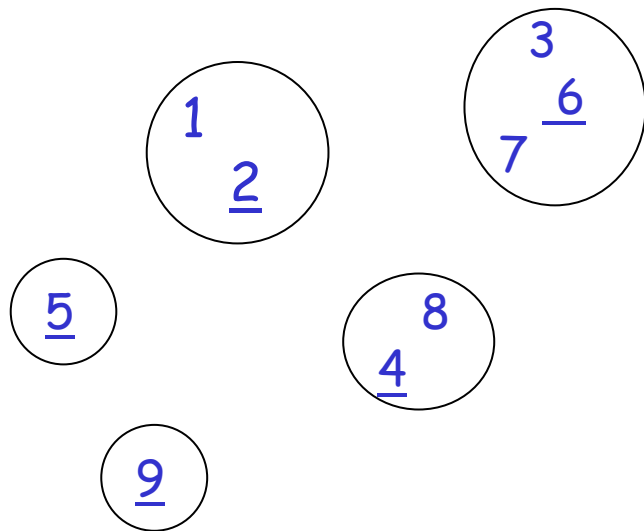
Yao; Chazelle, Rosenberg



# Union Find with Path Compressions

# Union Find with Path Compressions

Maintain partition of  $S = \{1, 2, \dots, n\}$   
under operations

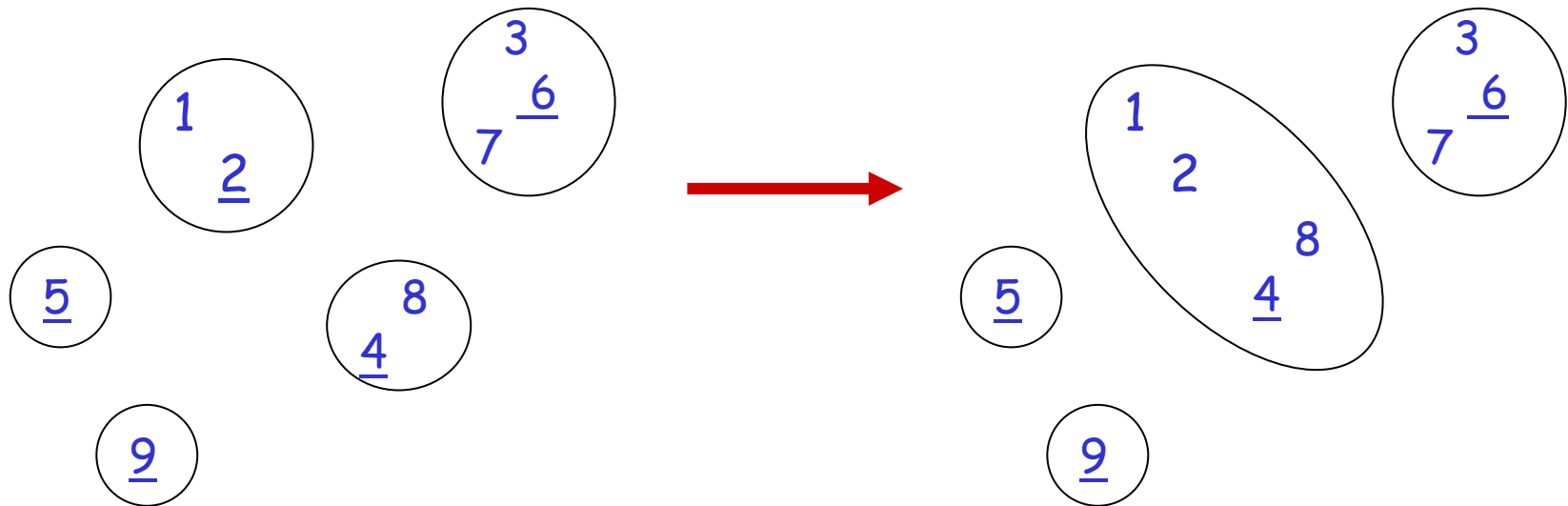


# Union Find with Path Compressions

Maintain partition of  $S = \{1, 2, \dots, n\}$

under operations

Union(2, 4)

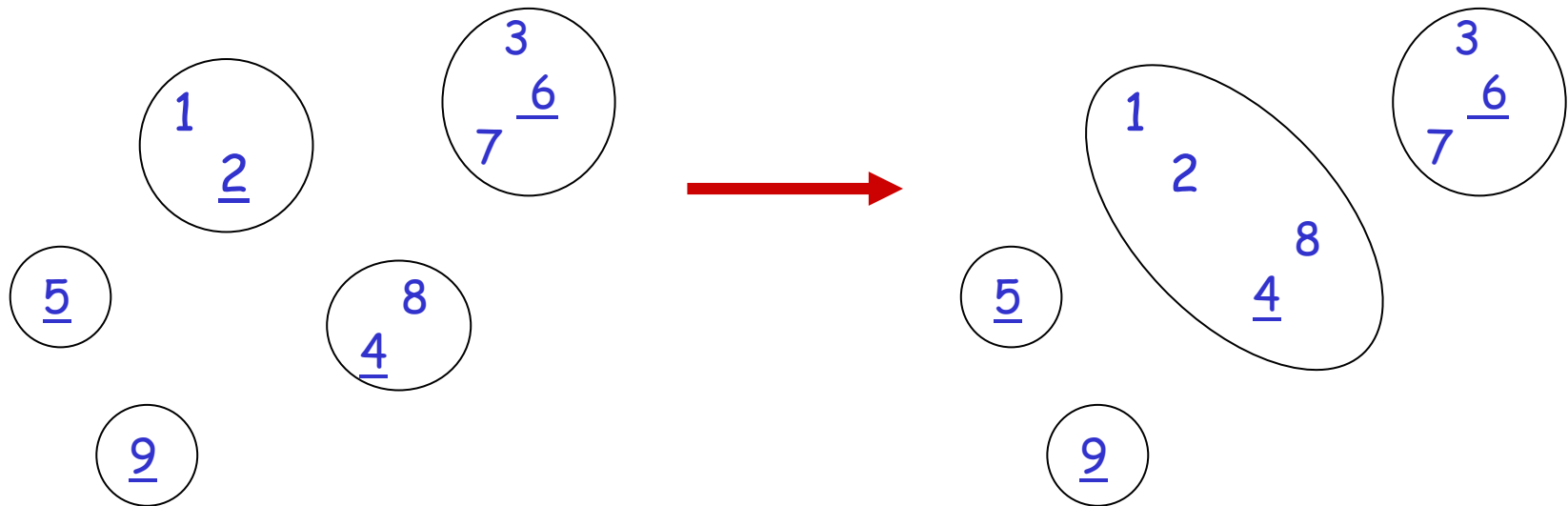


# Union Find with Path Compressions

Maintain partition of  $S = \{1, 2, \dots, n\}$

under operations

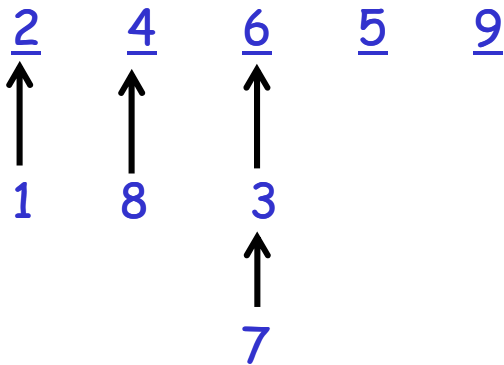
Union(2, 4)



Find(3) = 6 (representative element)

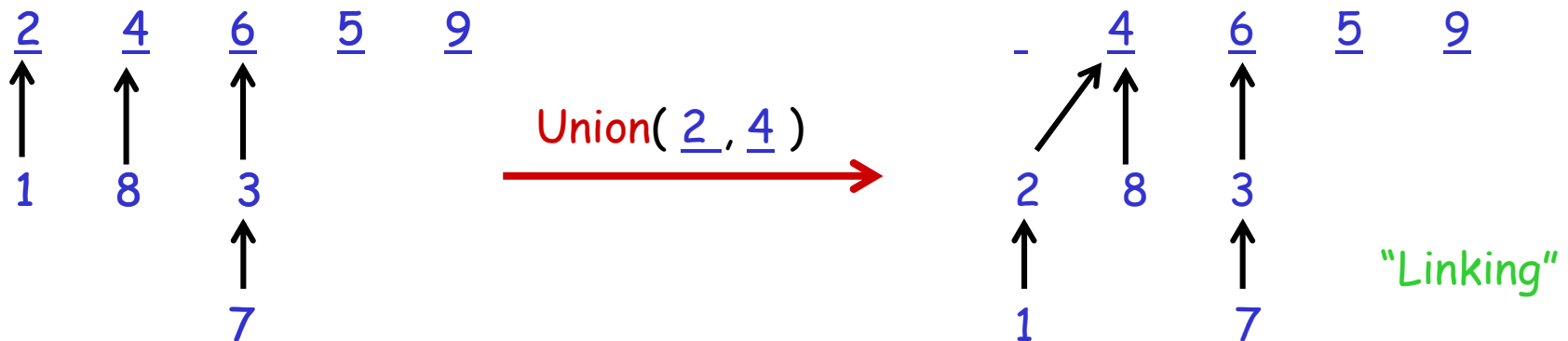
## Implementation

- \* forest  $\mathcal{F}$  of rooted trees with node set  $S$
- \* one tree for each group in current partition
- \* root of tree is representative of the group



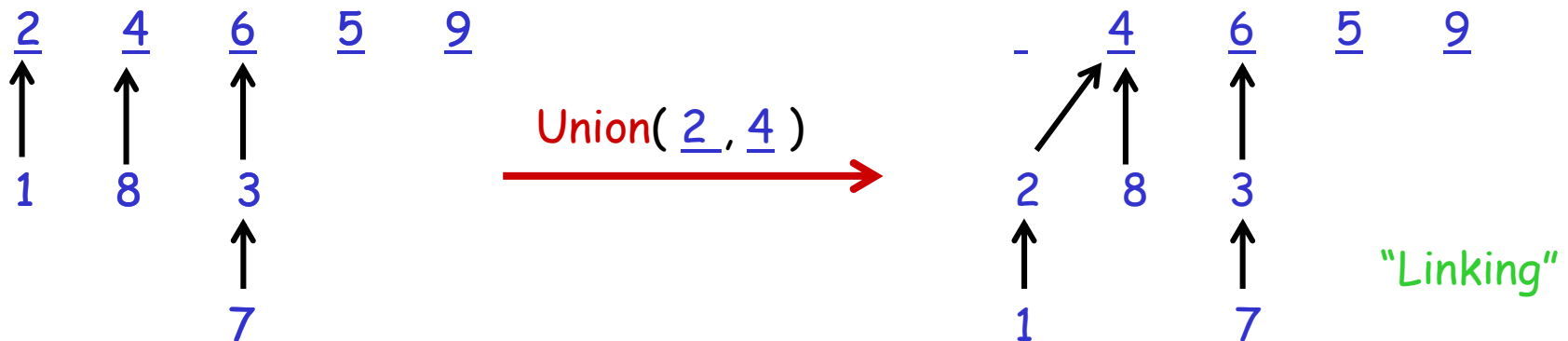
## Implementation

- \* forest  $\mathcal{F}$  of rooted trees with node set  $S$
- \* one tree for each group in current partition
- \* root of tree is representative of the group



## Implementation

- \* forest  $\mathcal{F}$  of rooted trees with node set  $S$
- \* one tree for each group in current partition
- \* root of tree is representative of the group

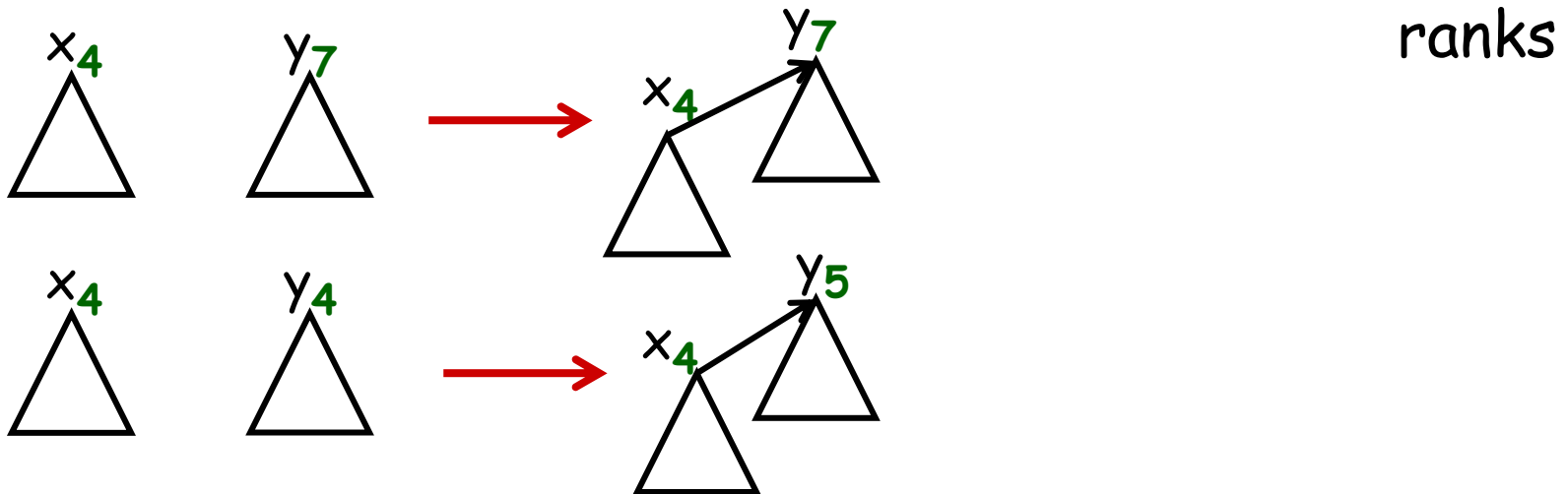


**Find**(  $x$  )      follow path from  $x$  to root

"path following"

# Heuristic 1: "linking by rank"

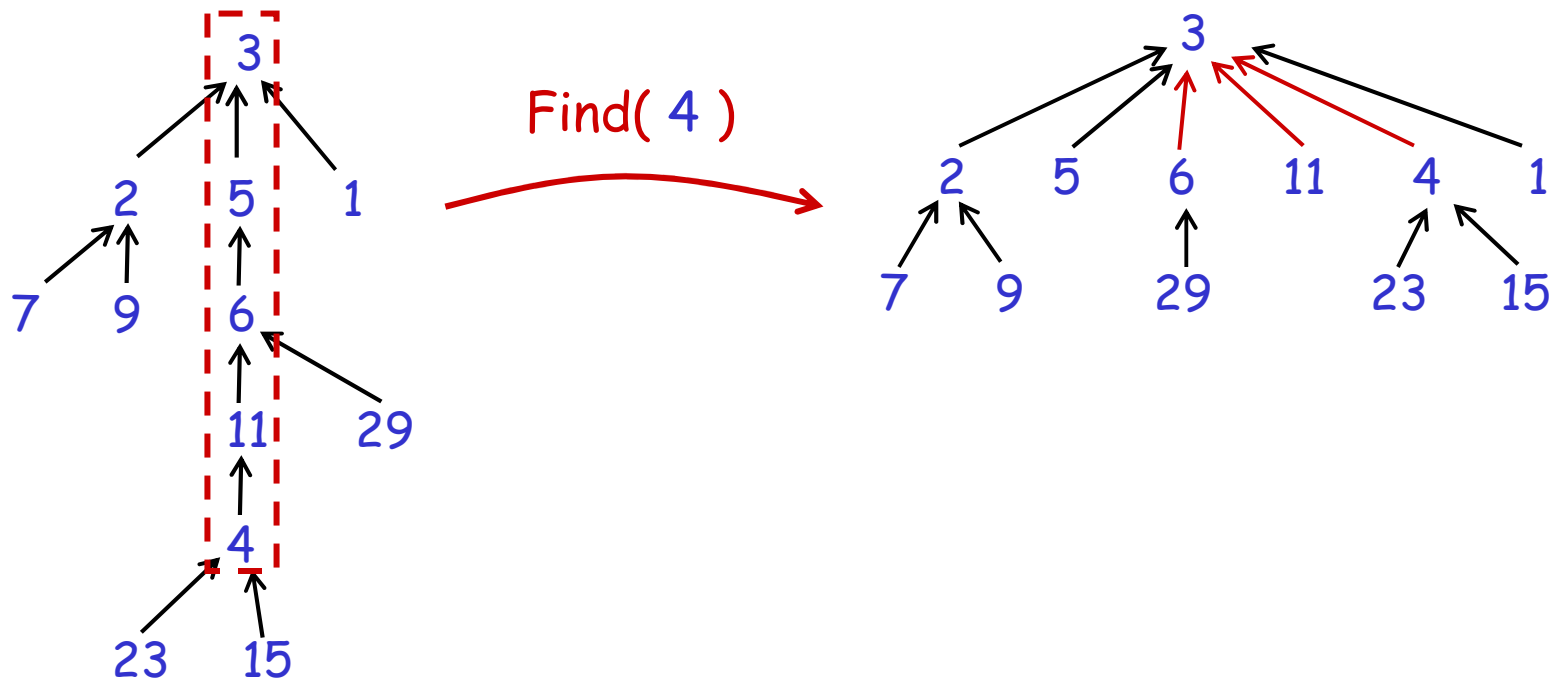
- each node  $x$  carries integer  $rk(x)$
- initially  $rk(x) = 0$
- as soon as  $x$  is NOT a root,  $rk(x)$  stays unchanged
- for  $\text{Union}(x, y)$  make node with smaller rank child of the other  
in case of tie, increment one of the ranks





## Heuristic 2: Path compression

when performin a Find( x ) operation make all nodes in the "findpath" children of the root



sequence of **Union** and **Find** operation

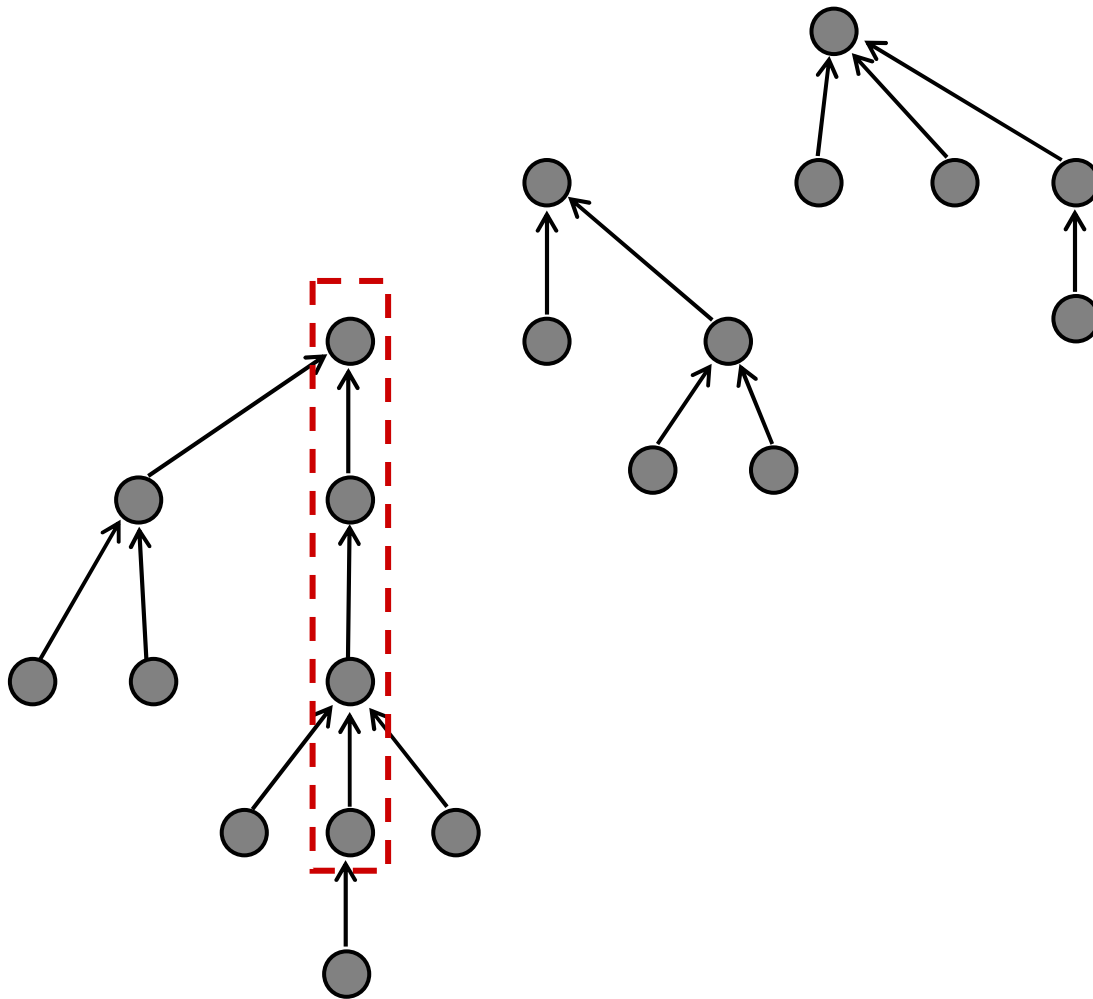
Explicit cost model:

$\text{cost}(op) = \# \text{ times some node gets a new parent}$

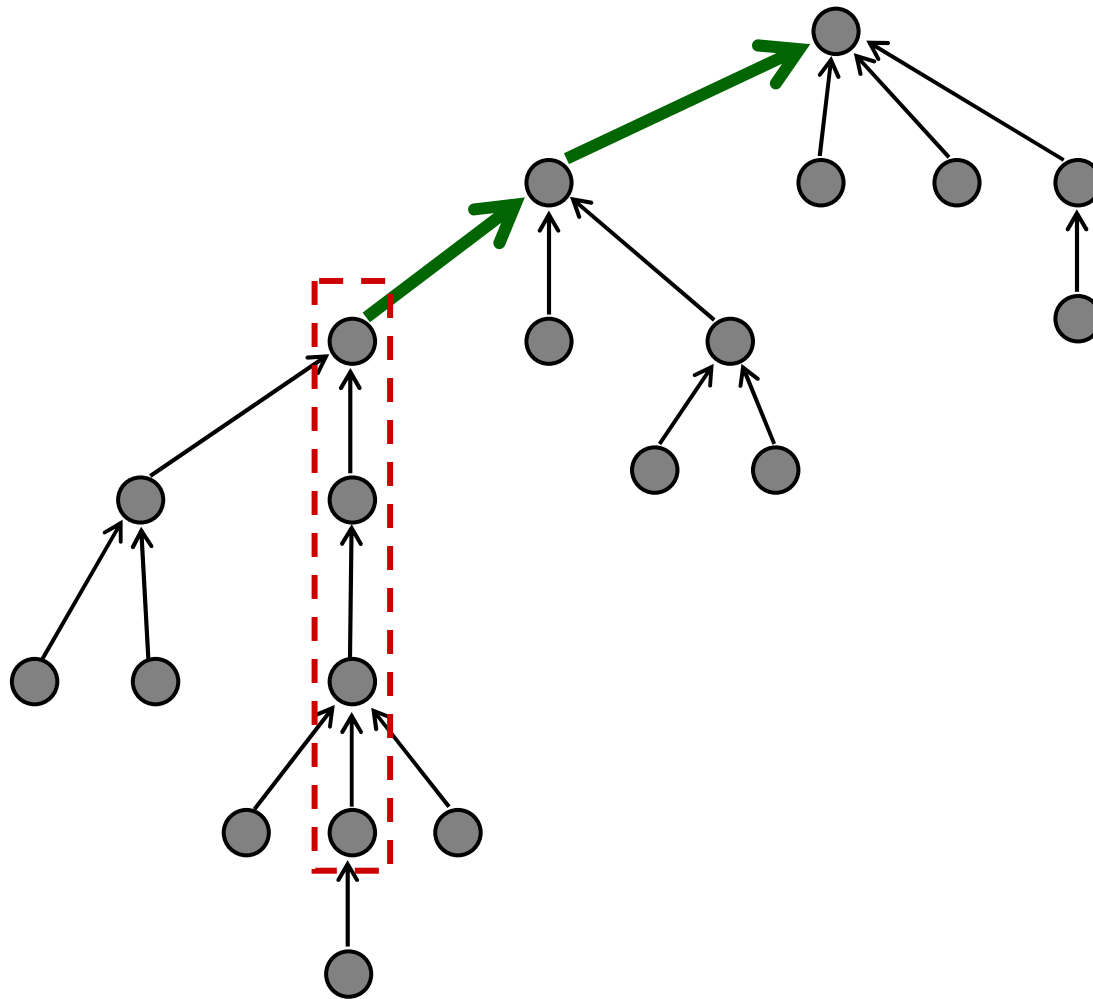
Time for **Union**( $x, y$ ) =  $O(1) = O(\text{cost}(\text{Union}(x,y)))$

Time for **Find**( $x$ ) =  $O(\# \text{ of nodes on findpath})$   
=  $O(2 + \text{cost}(\text{Find}(x)))$

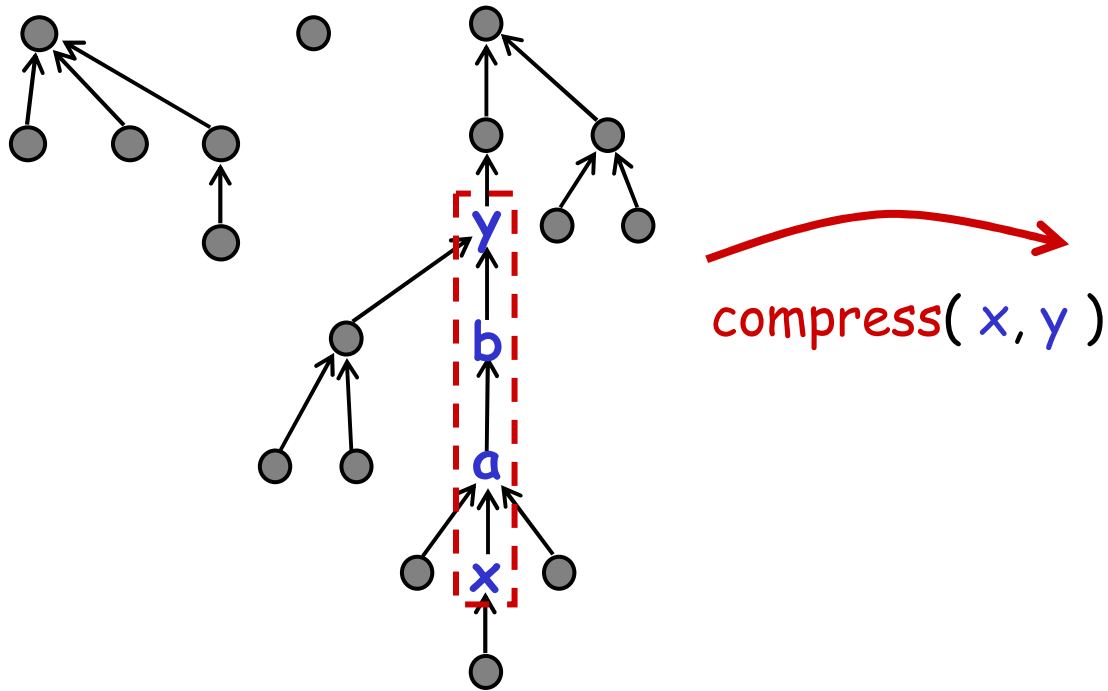
For analysis assume all **Unions** are performed first, but **Find**-paths are only followed (and compressed) to correct node.



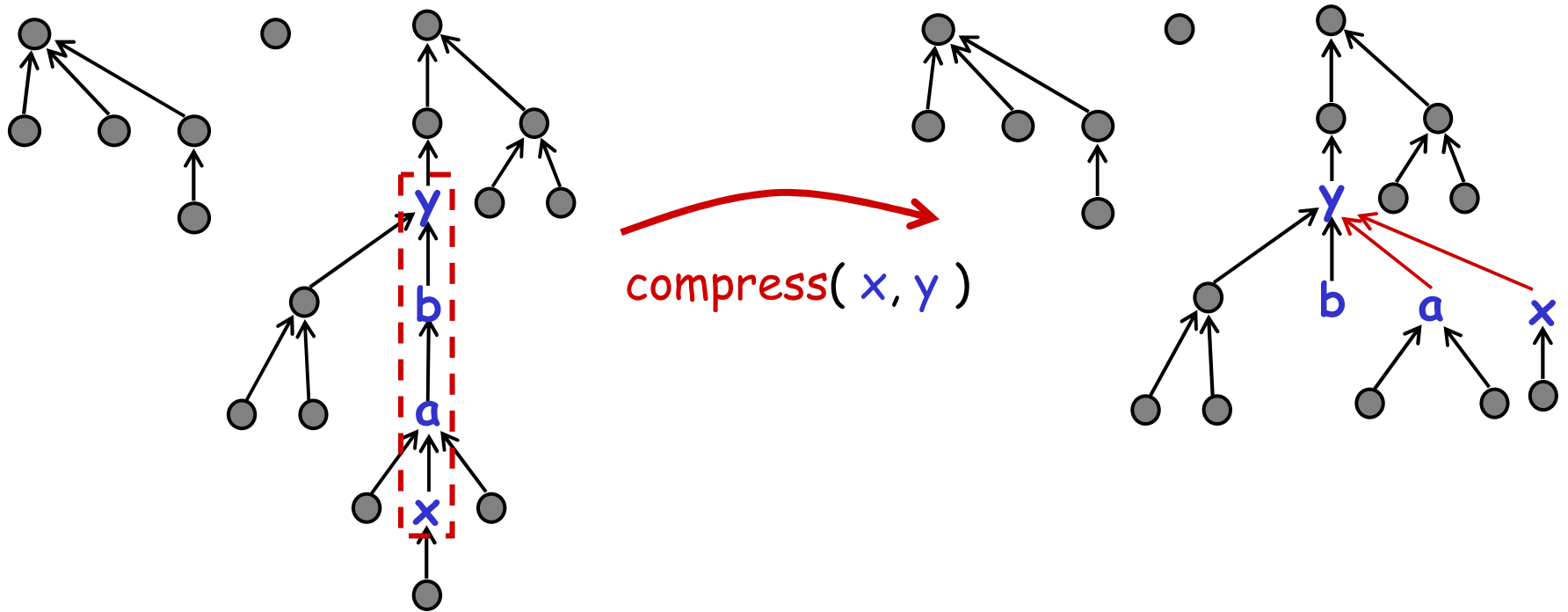
For analysis assume all **Unions** are performed first, but **Find**-paths are only followed (and compressed) to correct node.



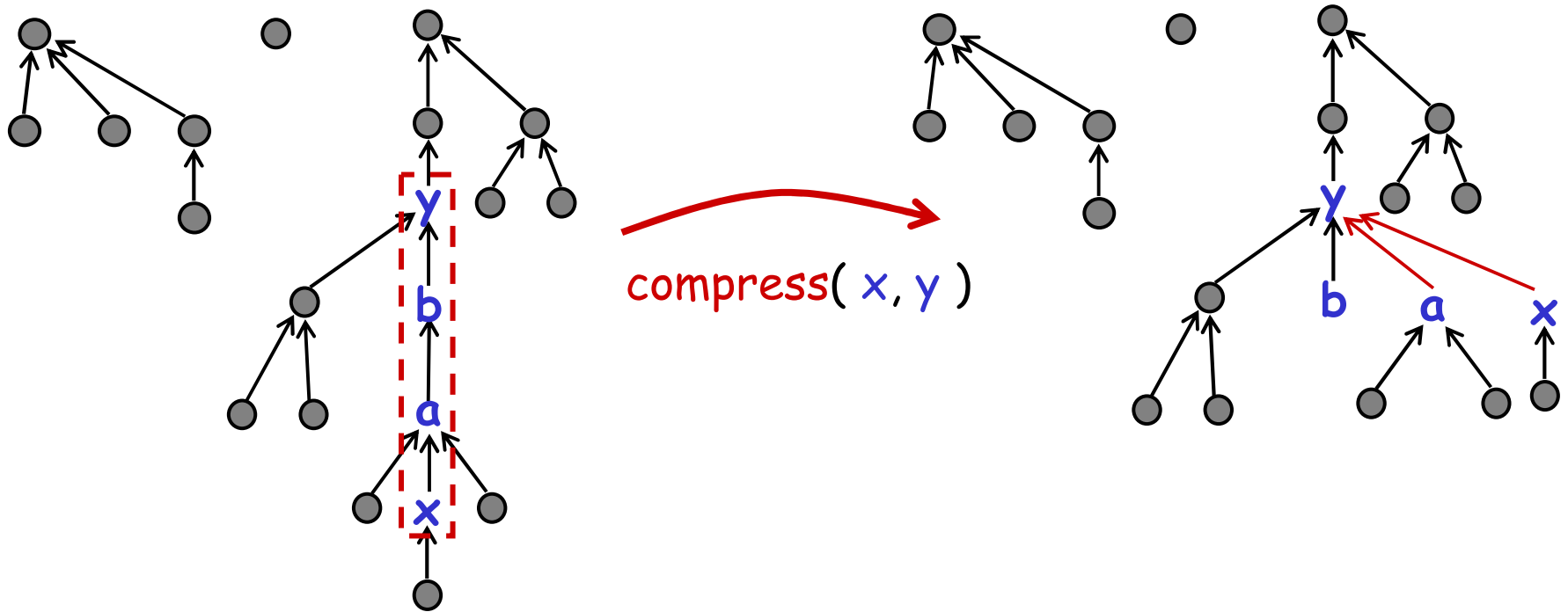
# General path compression in forest $\mathcal{F}$



# General path compression in forest $\mathcal{F}$



# General path compression in forest $\mathcal{F}$



$\text{cost}(\text{compress}(x, y)) = \# \text{ of nodes that get a new parent}$

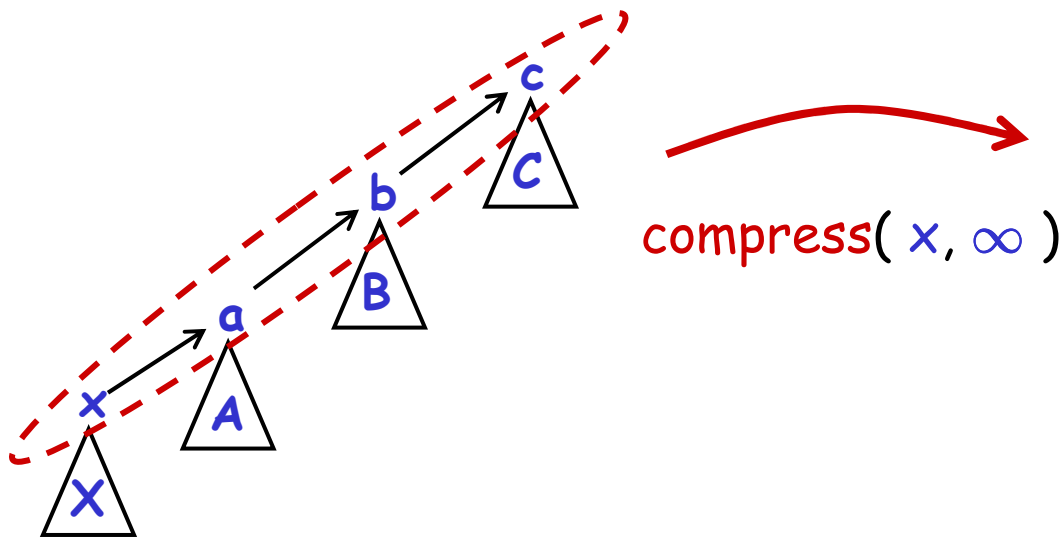
# General path compression in forest $\mathcal{F}$

"rootpath compress"



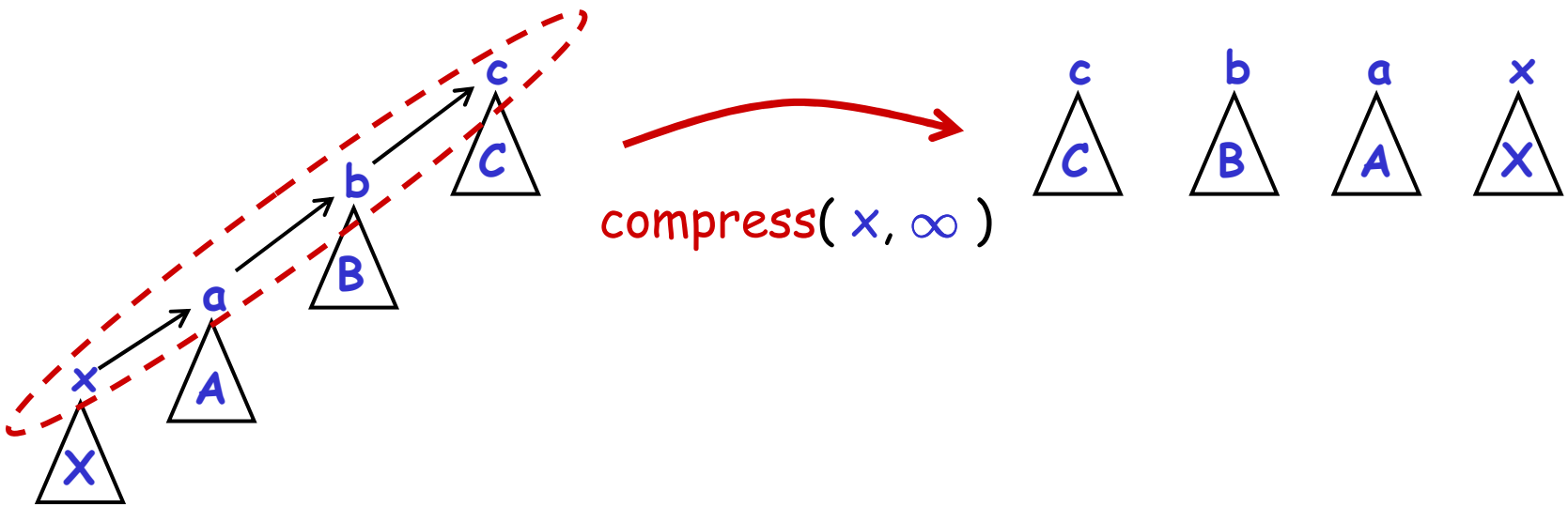
# General path compression in forest $\mathcal{F}$

"rootpath compress"



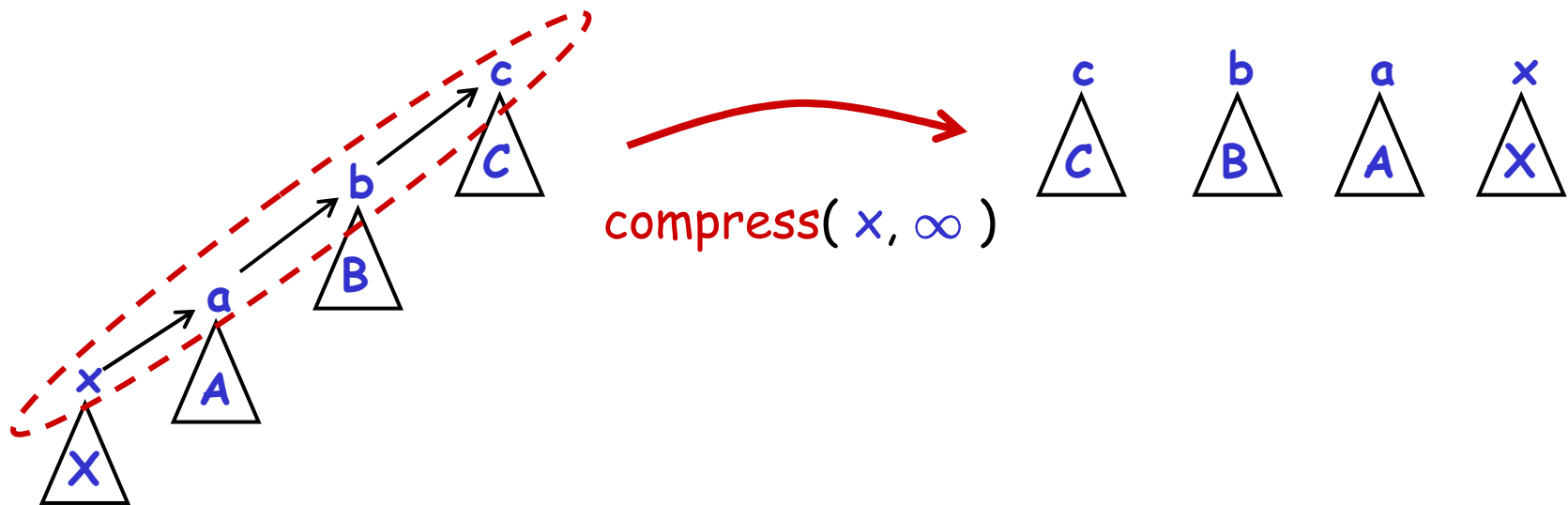
# General path compression in forest $\mathcal{F}$

"rootpath compress"



# General path compression in forest $\mathcal{F}$

"rootpath compress"



$$\begin{aligned} \text{cost}(\text{compress}(x, \infty)) &= \# \text{ of nodes that get a} \\ &\quad \text{new parent} \\ &= 0 \end{aligned}$$

## Problem formulation

$\mathcal{F}$  forest on node set  $X$

$\mathcal{C}$  sequence of compress operations on  $\mathcal{F}$

$|\mathcal{C}|$  = # of true compress operations in  $\mathcal{C}$

(rootpath compresses excluded)

$\text{cost}(\mathcal{C}) = \sum(\text{cost of individual operations})$

## Problem formulation

$\mathcal{F}$  forest on node set  $X$

$\mathcal{C}$  sequence of compress operations on  $\mathcal{F}$

$|\mathcal{C}| = \#$  of true compress operations in  $\mathcal{C}$

(rootpath compresses excluded)

$\text{cost}(\mathcal{C}) = \sum(\text{cost of individual operations})$

How large can  $\text{cost}(\mathcal{C})$  be at most,  
in terms of  $|X|$  and  $|\mathcal{C}|$  ?

**Dissection** of a forest  $\mathcal{F}$  with node set  $X$  :

partition of  $X$  into "top part"  $X_+$   
and "bottom part"  $X_b$

so that top part  $X_+$  is "upwards closed",

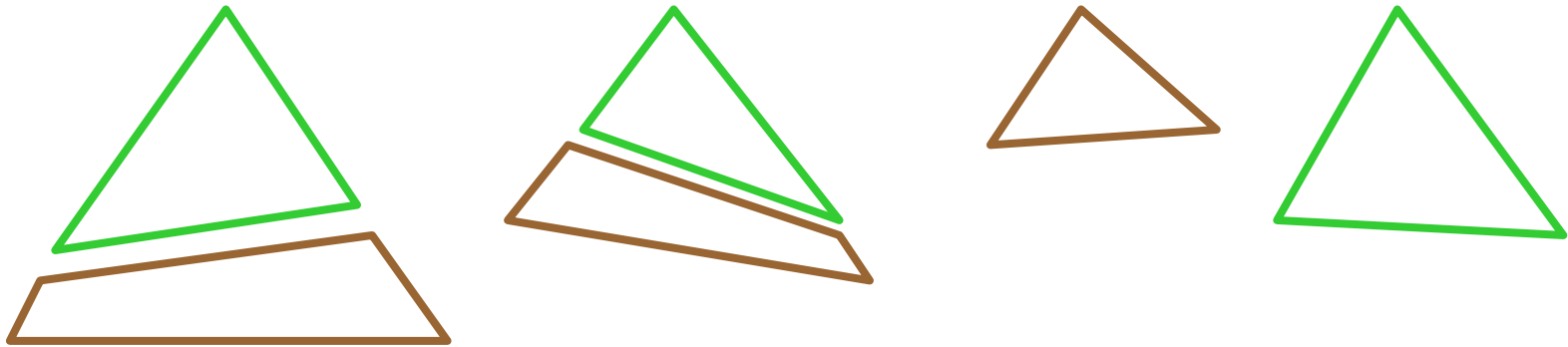
i.e.  $x \in X_+ \Rightarrow$  every ancestor of  $x$  is in  $X_+$  also

**Dissection** of a forest  $\mathcal{F}$  with node set  $X$  :

partition of  $X$  into "top part"  $X_+$   
and "bottom part"  $X_b$

so that top part  $X_+$  is "upwards closed",

i.e.  $x \in X_+ \Rightarrow$  every ancestor of  $x$  is in  $X_+$  also

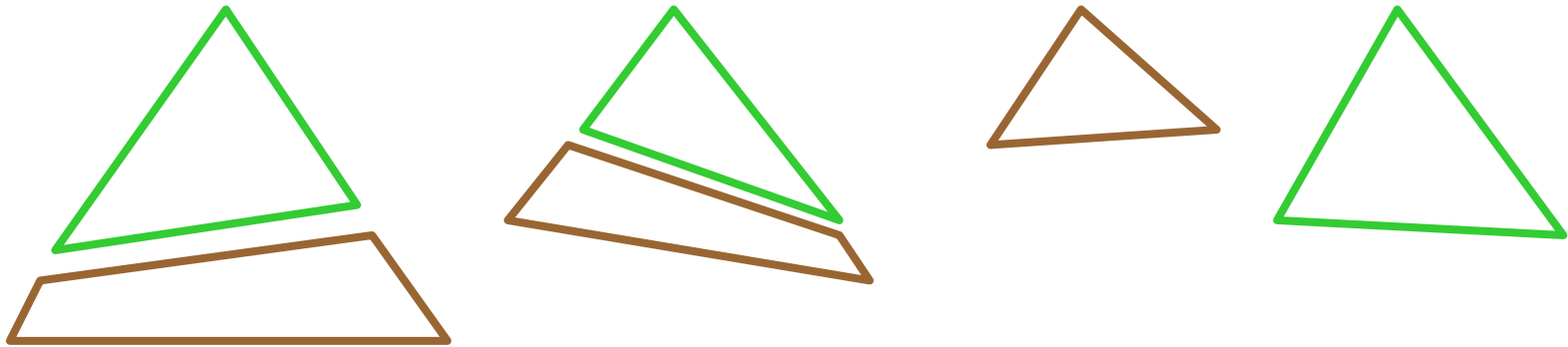


**Dissection** of a forest  $\mathcal{F}$  with node set  $X$  :

partition of  $X$  into "top part"  $X_+$   
and "bottom part"  $X_b$

so that top part  $X_+$  is "upwards closed",

i.e.  $x \in X_+ \Rightarrow$  every ancestor of  $x$  is in  $X_+$  also



**Note:**  $X_+, X_b$  dissection for  $\mathcal{F}$   
 $\mathcal{F}'$  obtained from  $\mathcal{F}$  by  
sequence of path compressions }  $\Rightarrow$   $X_+, X_b$  is  
dissection for  $\mathcal{F}'$



## Main Lemma:

$C$  ... sequence of operations on  $\mathcal{F}$  with node set  $X$   
 $X_+$ ,  $X_b$  dissection for  $\mathcal{F}$  inducing subforests  $\mathcal{F}_+$ ,  $\mathcal{F}_b$

## Main Lemma:

$C$  ... sequence of operations on  $\mathcal{F}$  with node set  $X$   
 $X_+$ ,  $X_b$  dissection for  $\mathcal{F}$  inducing subforests  $\mathcal{F}_+$ ,  $\mathcal{F}_b$

$\Rightarrow \exists$  compression sequences  
 $C_b$  for  $\mathcal{F}_b$  and  $C_+$  for  $\mathcal{F}_+$   
with and

$$|C_b| + |C_+| \leq |C|$$

and

$$\text{cost}(C) \leq \text{cost}(C_b) + \text{cost}(C_+) + |X_b| + |C_+|$$

**Proof:** 1) How to get  $C_b$  and  $C_+$  from  $C$ :

**Proof:** 1) How to get  $C_b$  and  $C_+$  from  $C$ :

compression paths from  $C$

case 1:  $\begin{matrix} Y \\ \uparrow \\ \vdots \\ X \end{matrix}$   $\begin{matrix} Y \\ \uparrow \\ \vdots \\ X \end{matrix}$  into  $C_+$

**Proof:** 1) How to get  $C_b$  and  $C_+$  from  $C$ :

compression paths from  $C$

case 1:  $\begin{array}{c} Y \\ \uparrow \\ \vdots \\ X \end{array}$  into  $C_+$

case 2:  $\begin{array}{c} Y \\ \uparrow \\ \vdots \\ X \end{array}$  into  $C_b$

**Proof:** 1) How to get  $C_b$  and  $C_+$  from  $C$ :

compression paths from  $C$

case 1:  $\begin{array}{c} Y \\ \uparrow \\ \dots \\ X \end{array}$  into  $C_+$

case 2:  $\begin{array}{c} Y \\ \uparrow \\ \dots \\ X \end{array}$  into  $C_b$

case 3:  $\begin{array}{c} Y \\ \uparrow \\ \dots \\ X' \\ \uparrow \\ \dots \\ X \end{array}$  into  $C_+$

$\begin{array}{c} Y \\ \uparrow \\ \dots \\ X' \\ \uparrow \\ \dots \\ \infty \\ \uparrow \\ \dots \\ X \end{array}$  into  $C_b$

**Proof:**

$$|C_b| + |C_+| \leq |C|$$

compression paths from  $C$



$$\text{cost}(C) \leq \text{cost}(C_b) + \text{cost}(C_+) + |X_b| + |C_+|$$

$\text{cost}(C)$

green node gets new green parent:

accounted by  $\text{cost}(C_+)$

brown node gets new brown parent:

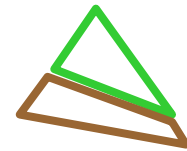
accounted by  $\text{cost}(C_b)$

brown node gets new green parent:  
for the first time

accounted by  $|X_b|$

brown node gets new green parent:  
again

accounted by  $|C_+|$





$f(m,n)$  ... maximum cost of any compression sequence  $C$  with  $|C|=m$  in an arbitrary forest with  $n$  nodes.

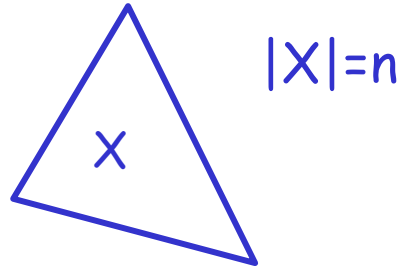
**Claim:**  $f(m,n) \leq (m+n) \cdot \log_2 n$

**Claim:**  $f(m,n) \leq (m+n) \cdot \log_2 n$

Claim:  $f(m,n) \leq (m+n) \cdot \log_2 n$

Proof:

forest  $\mathcal{F}$

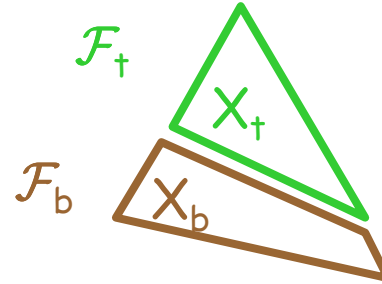
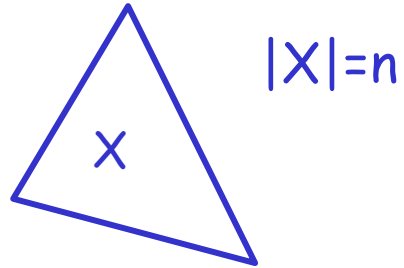


$C$  compression sequence  $|C|=m$

Claim:  $f(m,n) \leq (m+n) \cdot \log_2 n$

Proof:

forest  $\mathcal{F}$



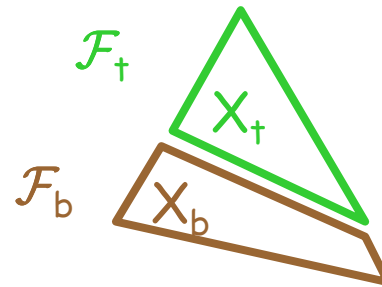
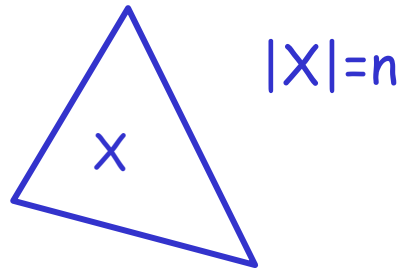
$$|X_+| = |X_b| = n/2$$

$\mathcal{C}$  compression sequence  $|\mathcal{C}|=m$

Claim:  $f(m,n) \leq (m+n) \cdot \log_2 n$

Proof:

forest  $\mathcal{F}$



$$|X_+|=|X_b|=n/2$$

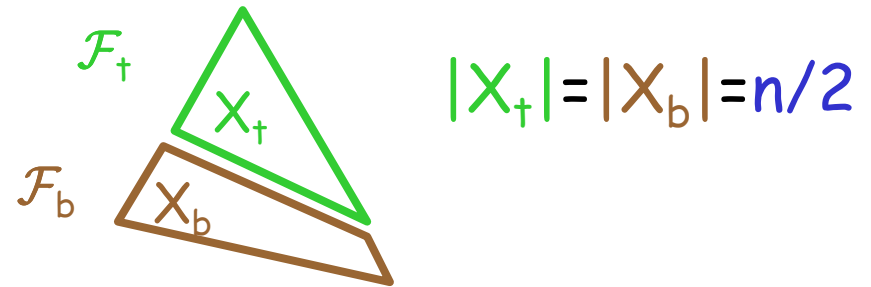
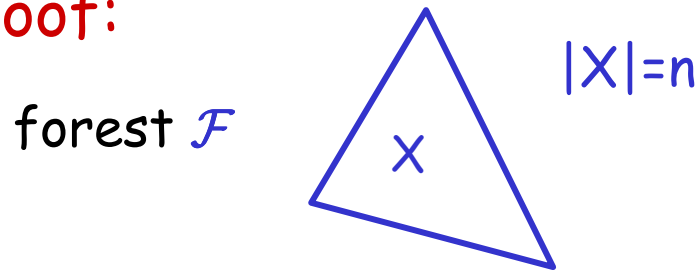
$C$  compression sequence  $|C|=m$

Main Lemma  $\Rightarrow \exists C_+, C_b$   $|C_b|+|C_+| \leq |C|$   
 $m_b + m_+ \leq m$

$$\text{cost}(C) \leq \text{cost}(C_b) + \text{cost}(C_+) + |X_b| + |C_+|$$

Claim:  $f(m,n) \leq (m+n) \cdot \log_2 n$

Proof:



$C$  compression sequence  $|C|=m$

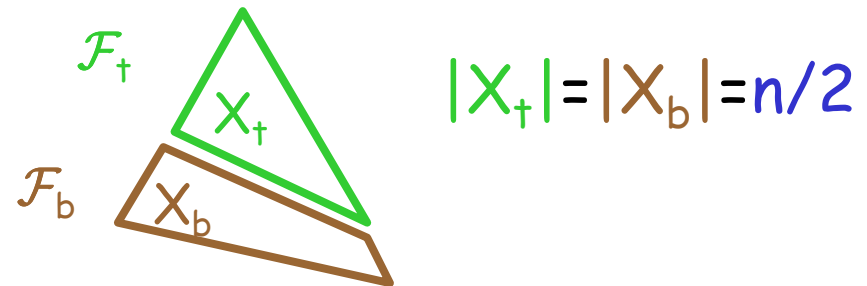
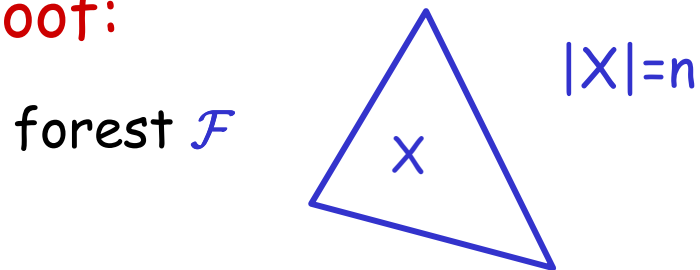
Main Lemma  $\Rightarrow \exists C_+, C_b$   $|C_b| + |C_+| \leq |C|$   
 $m_b + m_+ \leq m$

$$\text{cost}(C) \leq \text{cost}(C_b) + \text{cost}(C_+) + |X_b| + |C_+|$$

Induction:  $\leq (m_b + n/2) \log n/2 + (m_+ + n/2) \log n/2 + n/2 + m_+$

Claim:  $f(m,n) \leq (m+n) \cdot \log_2 n$

Proof:



$C$  compression sequence  $|C|=m$

Main Lemma  $\Rightarrow \exists C_+, C_b$   $|C_b|+|C_+| \leq |C|$   
 $m_b + m_+ \leq m$

$$\text{cost}(C) \leq \text{cost}(C_b) + \text{cost}(C_+) + |X_b| + |C_+|$$

$$\text{Induction: } \leq (m_b+n/2)\log n/2 + (m_++n/2)\log n/2 + n/2 + m_+$$

$$\leq (m+n) \cdot \log_2 n$$

## Corollary:

Any sequence of  $m$  Union, Find operations in a universe of  $n$  elements that uses arbitrary linking and path compression takes time at most

$$O((m+n) \cdot \log n)$$



### Corollary:

Any sequence of  $m$  Union, Find operations in a universe of  $n$  elements that uses arbitrary linking and path compression takes time at most

$$O((m+n) \cdot \log n)$$

By choosing a dissection that is "unbalanced" in relation to  $m/n$  one can prove a better bound of

$$O((m+n) \cdot \log_{\lceil m/n \rceil + 1} n)$$

# Path compression and union by rank

## Path compression and union by rank

Def:  $\mathcal{F}$  forest,  $x$  node in  $\mathcal{F}$

$r(x)$  = height of subtree rooted at  $x$   
(  $r(\text{leaf}) = 0$  )

$\mathcal{F}$  is a **rank forest**, if

for every node  $x$

for every  $i$  with  $0 \leq i < r(x)$ ,  
there is a child  $y_i$  of  $x$  with  $r(y_i) = i$ .

## Path compression and union by rank

**Def:**  $\mathcal{F}$  forest,  $x$  node in  $\mathcal{F}$   
 $r(x)$  = height of subtree rooted at  $x$   
(  $r(\text{leaf}) = 0$  )

$\mathcal{F}$  is a **rank forest**, if

for every node  $x$   
for every  $i$  with  $0 \leq i < r(x)$ ,  
there is a child  $y_i$  of  $x$  with  $r(y_i) = i$ .

Note: Union by rank produces rank forests !

## Path compression and union by rank

**Def:**  $\mathcal{F}$  forest,  $x$  node in  $\mathcal{F}$   
 $r(x)$  = height of subtree rooted at  $x$   
(  $r(\text{leaf}) = 0$  )

$\mathcal{F}$  is a **rank forest**, if

for every node  $x$   
for every  $i$  with  $0 \leq i < r(x)$ ,  
there is a child  $y_i$  of  $x$  with  $r(y_i) = i$ .

Note: Union by rank produces rank forests !

Lemma:  $r(x) = r \Rightarrow x$  is root of subtree with at least  $2^r$  nodes.

## Inheritance Lemma:

$\mathcal{F}$  rank forest with maximum rank  $r$  and node set  $X$

$$\begin{array}{ll} s \in \mathbb{N}: & X_{>s} = \{ x \in X \mid r(x) > s \} & \mathcal{F}_{>s} \\ & X_{\leq s} = \{ x \in X \mid r(x) \leq s \} & \mathcal{F}_{\leq s} \end{array} \quad \text{induced forests}$$

## Inheritance Lemma:

$\mathcal{F}$  rank forest with maximum rank  $r$  and node set  $X$

$$\begin{array}{ll} s \in \mathbb{N}: & X_{>s} = \{ x \in X \mid r(x) > s \} & \mathcal{F}_{>s} \\ & X_{\leq s} = \{ x \in X \mid r(x) \leq s \} & \mathcal{F}_{\leq s} \end{array} \quad \text{induced forests}$$

- i)  $X_{\leq s}, X_{>s}$  is a dissection for  $\mathcal{F}$
- ii)  $\mathcal{F}_{\leq s}$  is a rank forest with maximum rank  $\leq s$
- iii)  $\mathcal{F}_{>s}$  is a rank forest with maximum rank  $\leq r-s-1$
- iv)  $|X_{>s}| \leq |X| / 2^{s+1}$

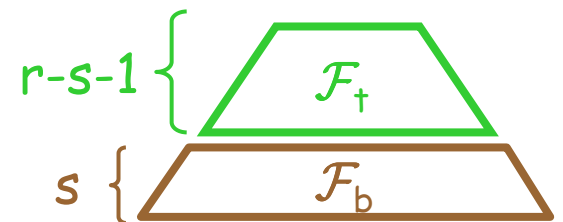
# Inheritance Lemma:

$\mathcal{F}$  rank forest with maximum rank  $r$  and node set  $X$

$$s \in \mathbb{N}: \quad X_{>s} = \{ x \in X \mid r(x) > s \} \quad \mathcal{F}_{>s} \quad \text{induced forests}$$

$$X_{\leq s} = \{ x \in X \mid r(x) \leq s \} \quad \mathcal{F}_{\leq s}$$

- i)  $X_{\leq s}, X_{>s}$  is a dissection for  $\mathcal{F}$
- ii)  $\mathcal{F}_{\leq s}$  is a rank forest with maximum rank  $\leq s$
- iii)  $\mathcal{F}_{>s}$  is a rank forest with maximum rank  $\leq r-s-1$
- iv)  $|X_{>s}| \leq |X| / 2^{s+1}$





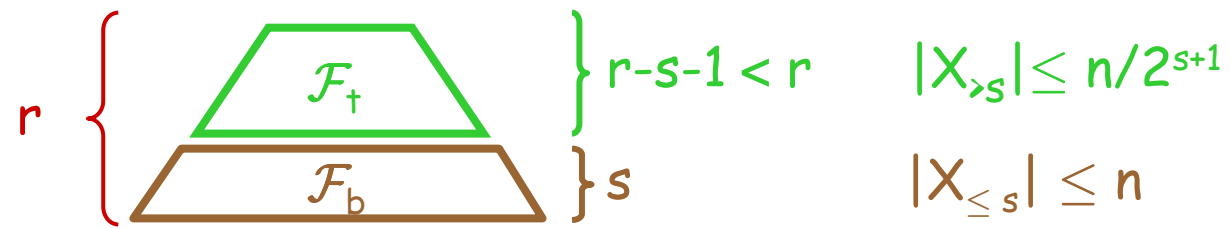
$f(m,n,r)$  = maximum cost of any compression sequence  $C$ , with  $|C|=m$ , in rank forest  $\mathcal{F}$  with  $n$  nodes and maximum rank  $r$ .

$f(m,n,r)$  = maximum cost of any compression sequence  $C$ , with  $|C|=m$ , in rank forest  $\mathcal{F}$  with  $n$  nodes and maximum rank  $r$ .

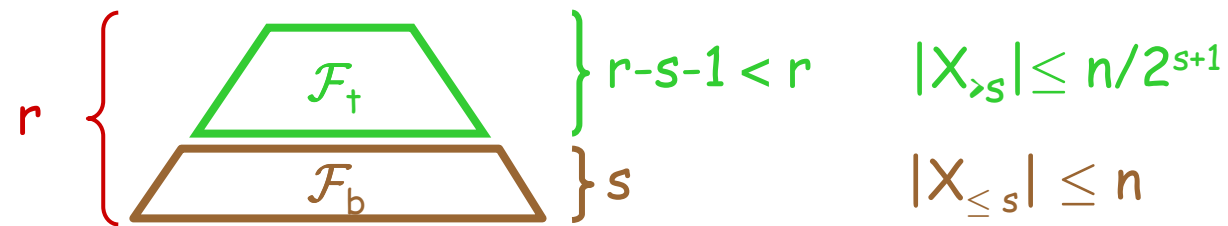
Trivial bounds:

$$f(m,n,r) \leq (r-1) \cdot n$$

$$f(m,n,r) \leq (r-1) \cdot m$$

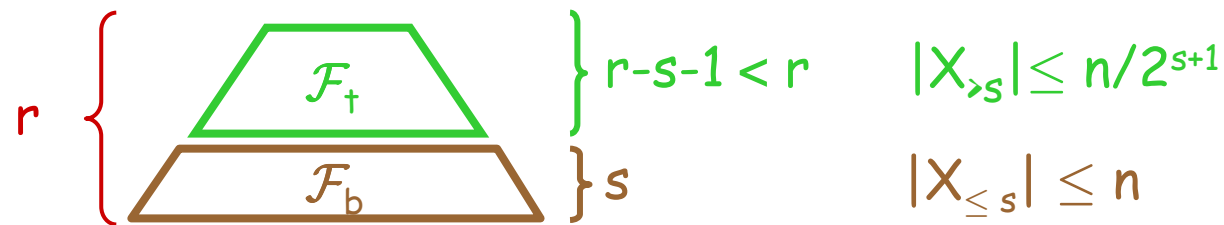


$$f(M, N, R) \leq N \cdot R$$



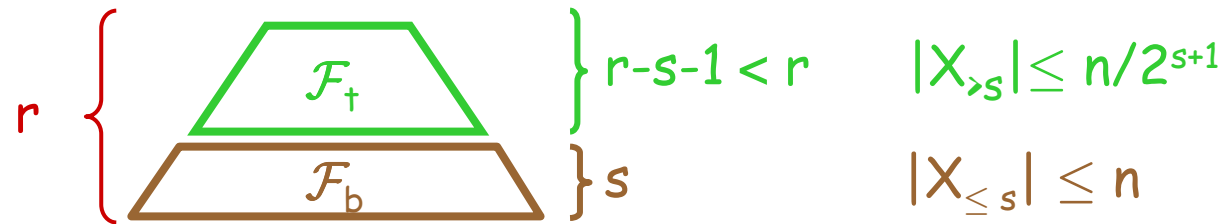
$$f(M, N, R) \leq N \cdot R$$

$$\text{cost}(C) \leq \text{cost}(C_+) + \text{cost}(C_b) + |X_b| + |C_+|$$



$$f(M, N, R) \leq N \cdot R$$

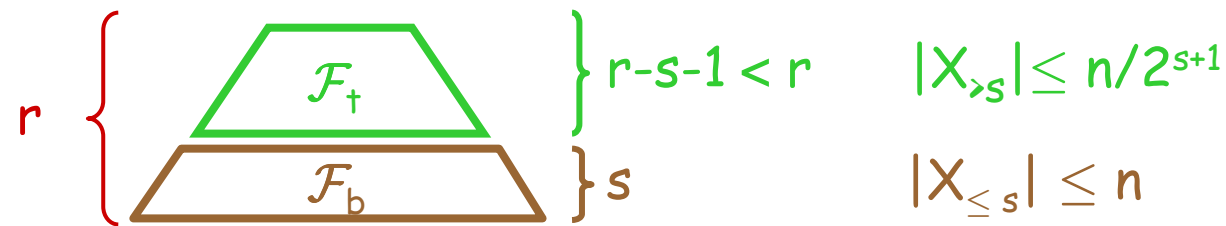
$$\begin{aligned}
 \text{cost}(C) &\leq \underbrace{\text{cost}(C_+)} + \text{cost}(C_b) + \underbrace{|X_b|} + |C_+| \\
 &\leq (n/2^{s+1}) \cdot r \qquad \qquad \qquad \leq n
 \end{aligned}$$



$$f(M, N, R) \leq N \cdot R$$

$$\begin{aligned}
 \text{cost}(C) &\leq \underbrace{\text{cost}(C_+)} + \text{cost}(C_b) + \underbrace{|X_b|} + |C_+| \\
 &\leq (n/2^{s+1}) \cdot r && \leq n
 \end{aligned}$$

$$s = \log r \leq n$$

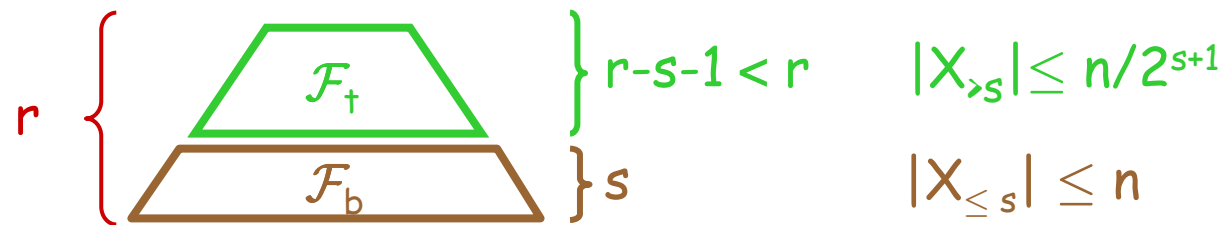


$$f(M, N, R) \leq N \cdot R$$

$$\text{cost}(C) \leq \underbrace{\text{cost}(C_+)}_{\leq (n/2^{s+1}) \cdot r} + \text{cost}(C_b) + \underbrace{|X_b|}_{\leq n} + |C_+|$$

$$s = \log r \leq n$$

$$\text{cost}(C) \leq 2n + \text{cost}(C_b) + |C_+|$$



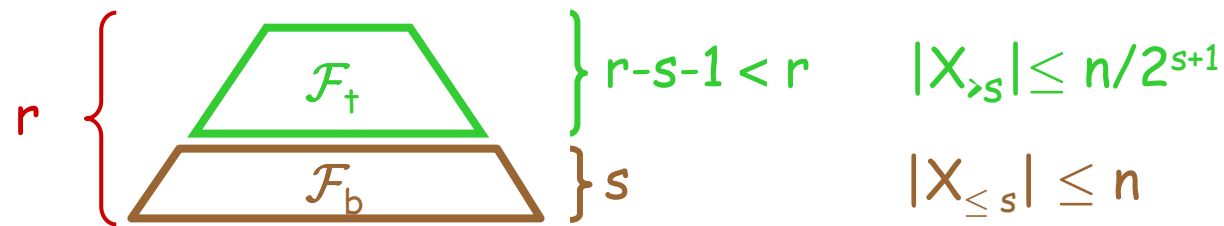
$$f(M, N, R) \leq N \cdot R$$

$$\text{cost}(C) \leq \underbrace{\text{cost}(C_+)}_{\leq (n/2^{s+1}) \cdot r} + \text{cost}(C_b) + \underbrace{|X_b|}_{\leq n} + |C_+|$$

$$s = \log r \leq n$$

$$\text{cost}(C) \leq 2n + \text{cost}(C_b) + |C_+| \Big| - \underbrace{(|C_b| + |C_+|)}_{=|C|}$$





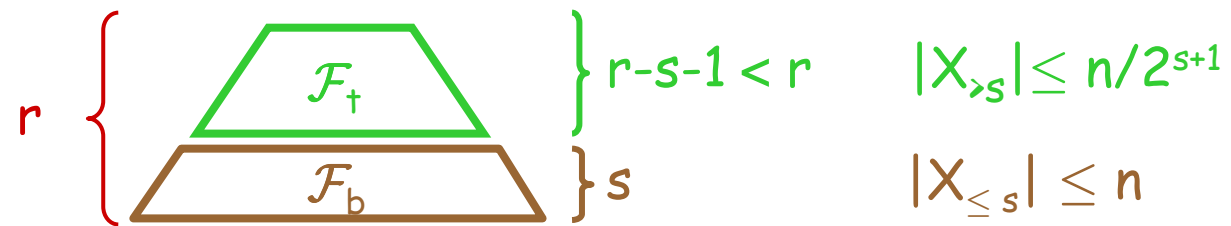
$$f(M, N, R) \leq N \cdot R$$

$$\begin{aligned} \text{cost}(C) &\leq \underbrace{\text{cost}(C_+)} + \text{cost}(C_b) + \underbrace{|X_b|} + |C_+| \\ &\leq (n/2^{s+1}) \cdot r \qquad \qquad \qquad \leq n \end{aligned}$$

$$s = \log r \qquad \leq n$$

$$\text{cost}(C) \leq 2n + \text{cost}(C_b) + |C_+| \quad \Bigg| \quad - \underbrace{(|C_b| + |C_+|)}_{=|C|}$$

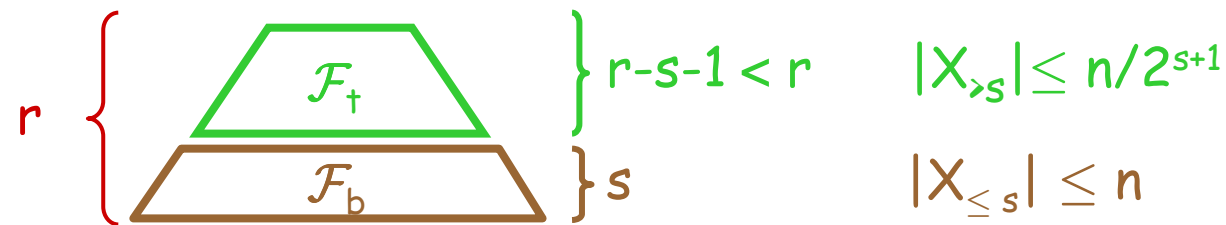
$$\text{cost}(C) - |C| \leq 2n + (\text{cost}(C_b) - |C_b|)$$



$$f(M, N, R) \leq N \cdot R$$

$$s = \log r$$

$$\text{cost}(C) - |C| \leq 2n + (\text{cost}(C_b) - |C_b|)$$

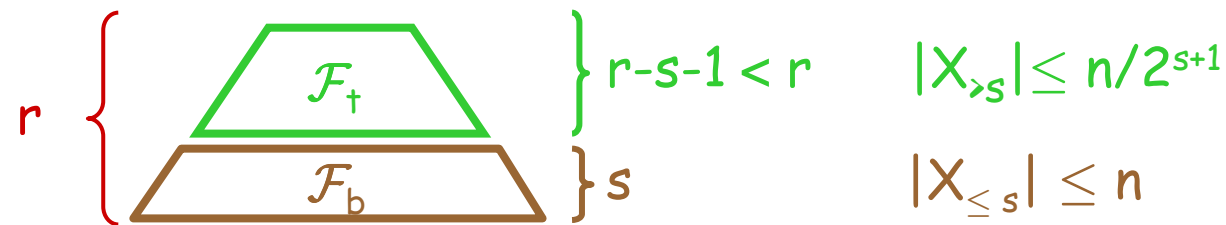


$$f(M, N, R) \leq N \cdot R$$

$$s = \log r$$

$$\text{cost}(C) - |C| \leq 2n + (\text{cost}(C_b) - |C_b|)$$

$$(f(m, n, r) - m) \leq 2n + (f(m_b, n, \log r) - m_b)$$



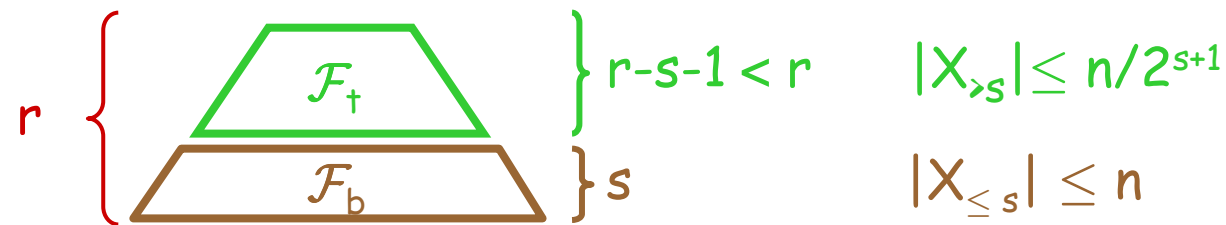
$$f(M, N, R) \leq N \cdot R$$

$$s = \log r$$

$$\text{cost}(C) - |C| \leq 2n + (\text{cost}(C_b) - |C_b|)$$

$$(f(m, n, r) - m) \leq 2n + (f(m_b, n, \log r) - m_b)$$

$$(f(m, n, r) - m) \leq 2n \cdot \log^* r$$



$$f(M, N, R) \leq N \cdot R$$

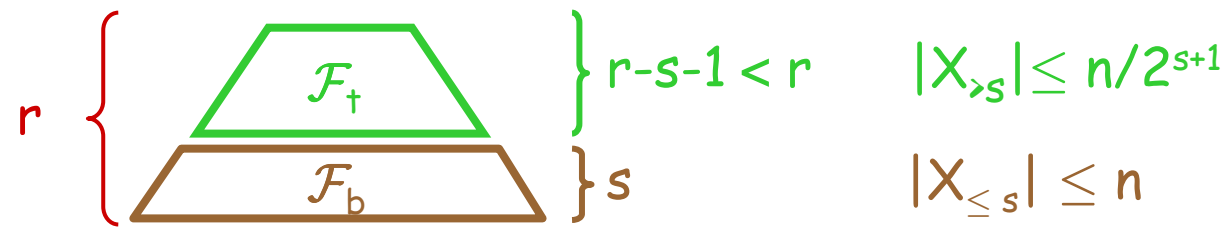
$$s = \log r$$

$$\text{cost}(C) - |C| \leq 2n + (\text{cost}(C_b) - |C_b|)$$

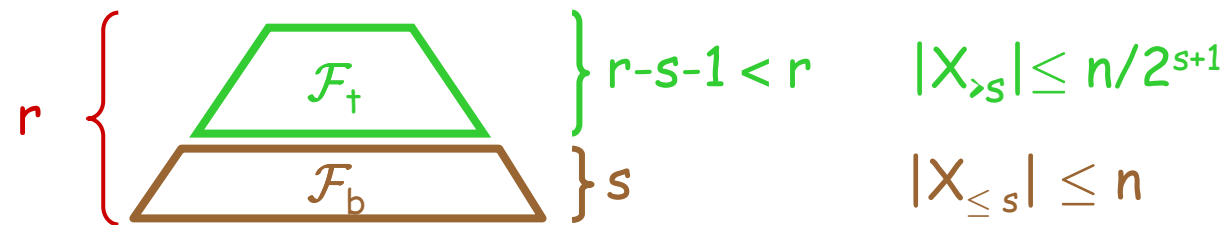
$$(f(m, n, r) - m) \leq 2n + (f(m_b, n, \log r) - m_b)$$

$$(f(m, n, r) - m) \leq 2n \cdot \log^* r$$

$$f(m, n, r) \leq m + 2n \cdot \log^* r$$

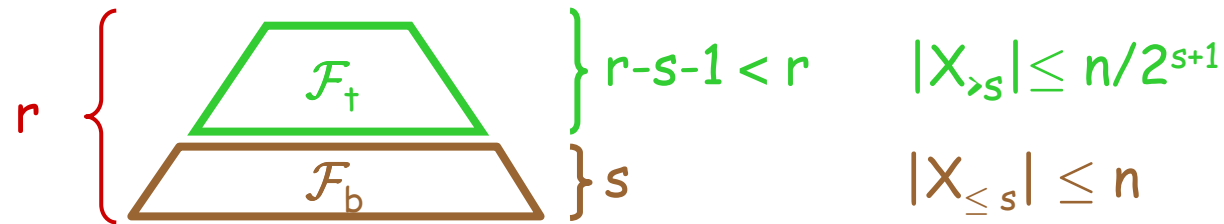


$$f(M, N, R) \leq M + 2N \cdot \log^* R$$



$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

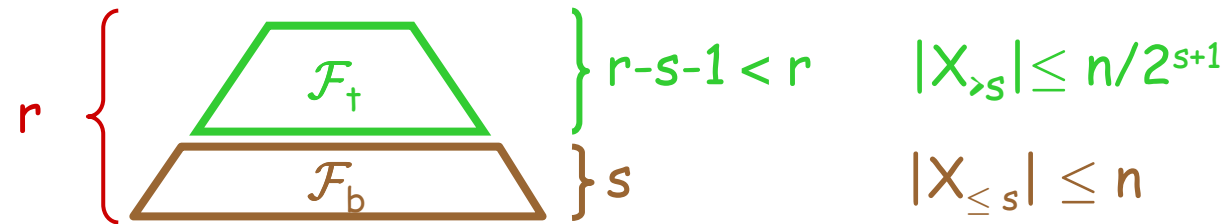
$$\text{cost}(C) \leq \text{cost}(C_+) + \text{cost}(C_b) + |X_b| + |C_+|$$



$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

$$\begin{aligned}
 \text{cost}(C) &\leq \underbrace{\text{cost}(C_+)} + \text{cost}(C_b) + \underbrace{|X_b|} + |C_+| \\
 &\leq |C_+| + 2(n/2^{s+1}) \cdot \log^* r \qquad \leq n
 \end{aligned}$$

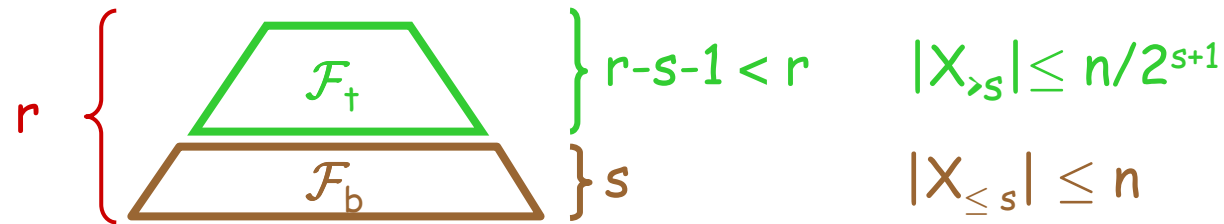




$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

$$\begin{aligned}
 \text{cost}(C) &\leq \underbrace{\text{cost}(C_+)} + \text{cost}(C_b) + \underbrace{|X_b|} + |C_+| \\
 &\leq |C_+| + 2(n/2^{s+1}) \cdot \log^* r \qquad \leq n
 \end{aligned}$$

$$s = \log \log^* r \leq |C_+| + n$$

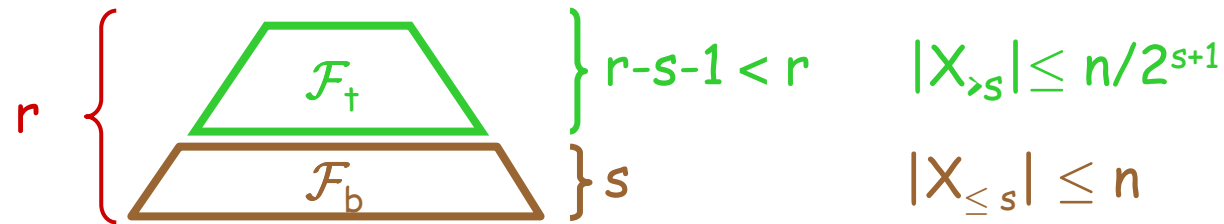


$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

$$\begin{aligned}
 \text{cost}(C) &\leq \underbrace{\text{cost}(C_+)} + \text{cost}(C_b) + \underbrace{|X_b|} + |C_+| \\
 &\leq |C_+| + 2(n/2^{s+1}) \cdot \log^* r \qquad \leq n
 \end{aligned}$$

$$s = \log \log^* r \leq |C_+| + n$$

$$\text{cost}(C) \leq 2n + \text{cost}(C_b) + 2|C_+|$$



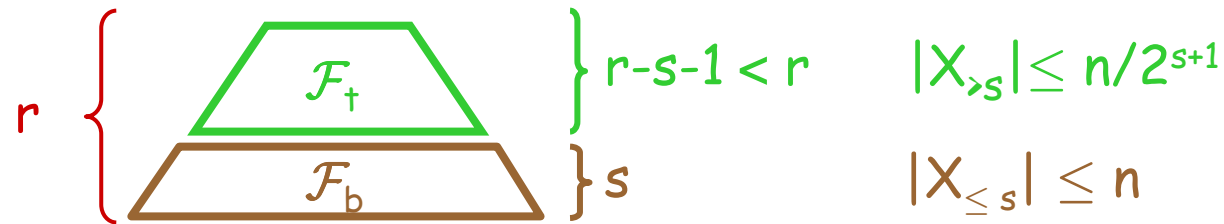
$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

$$\text{cost}(C) \leq \underbrace{\text{cost}(C_+)} + \text{cost}(C_b) + \underbrace{|X_b|} + |C_+|$$

$$\leq |C_+| + 2(n/2^{s+1}) \cdot \log^* r \leq n$$

$$s = \log \log^* r \leq |C_+| + n$$

$$\text{cost}(C) \leq 2n + \text{cost}(C_b) + 2|C_+| - 2 \overbrace{(|C_b| + |C_+|)}^{=|C|}$$



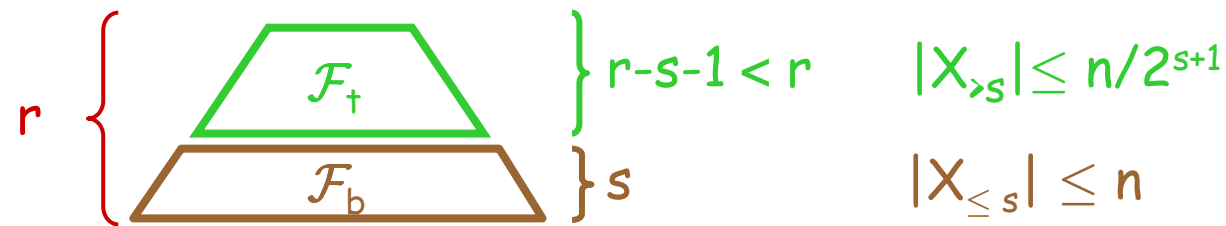
$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

$$\begin{aligned} \text{cost}(C) &\leq \underbrace{\text{cost}(C_+)} + \text{cost}(C_b) + \underbrace{|X_b|} + |C_+| \\ &\leq |C_+| + 2(n/2^{s+1}) \cdot \log^* r && \leq n \end{aligned}$$

$$s = \log \log^* r \leq |C_+| + n$$

$$\text{cost}(C) \leq 2n + \text{cost}(C_b) + 2|C_+| - 2 \overbrace{(|C_b| + |C_+|)}{=|C|}$$

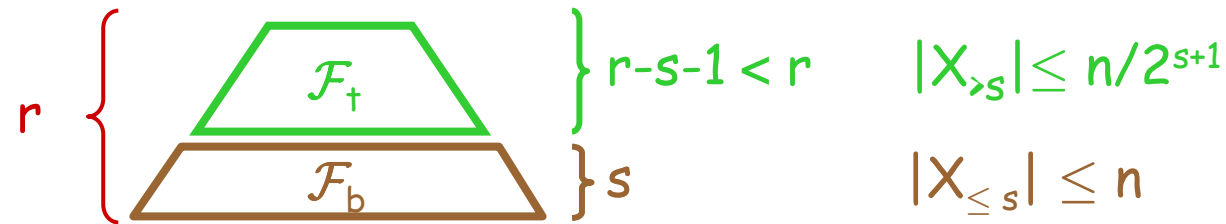
$$\text{cost}(C) - 2|C| \leq 2n + (\text{cost}(C_b) - 2|C_b|)$$



$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

$$s = \log \log^* r$$

$$\text{cost}(C) - 2|C| \leq 2n + (\text{cost}(C_b) - 2|C_b|)$$

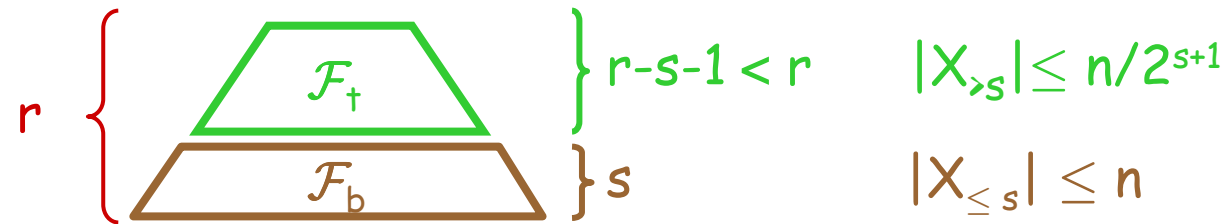


$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

$$s = \log \log^* r$$

$$\text{cost}(C) - 2|C| \leq 2n + (\text{cost}(C_b) - 2|C_b|)$$

$$(f(m, n, r) - 2m) \leq 2n + (f(m_b, n, \log \log^* r) - 2m_b)$$



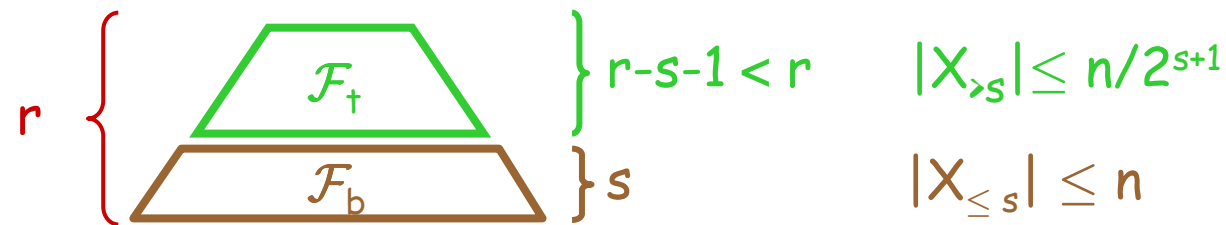
$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

$$s = \log \log^* r$$

$$\text{cost}(C) - 2|C| \leq 2n + (\text{cost}(C_b) - 2|C_b|)$$

$$(f(m, n, r) - 2m) \leq 2n + (f(m_b, n, \log \log^* r) - 2m_b)$$

$$(f(m, n, r) - 2m) \leq 2n \cdot (\log \log^*)^*(r)$$



$$f(M, N, R) \leq M + 2N \cdot \log^* R$$

$$s = \log \log^* r$$

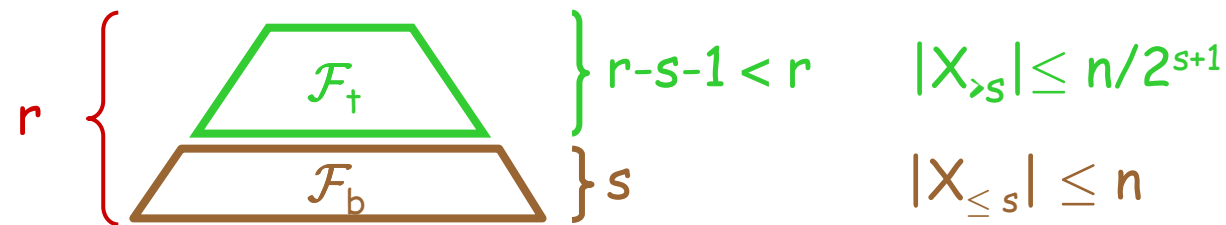
$$\text{cost}(C) - 2|C| \leq 2n + (\text{cost}(C_b) - 2|C_b|)$$

$$(f(m, n, r) - 2m) \leq 2n + (f(m_b, n, \log \log^* r) - 2m_b)$$

$$(f(m, n, r) - 2m) \leq 2n \cdot (\log \log^*)^*(r)$$

$$f(m, n, r) \leq 2m + 2n \cdot (\log \log^*)^*(r)$$





$$f(M, N, R) \leq k \cdot M + 2N \cdot g(R)$$

$$s = \log g(r)$$

$$\text{cost}(C) - (k+1) \cdot |C| \leq 2n + (\text{cost}(C_b) - (k+1) \cdot |C_b|)$$

$$(f(m, n, r) - (k+1) \cdot m) \leq 2n + (f(m_b, n, \log g(r)) - (k+1) \cdot m_b)$$

$$(f(m, n, r) - (k+1) \cdot m) \leq 2n \cdot (\log \circ g)^*(r)$$

$$f(m, n, r) \leq (k+1) \cdot m + 2n \cdot (\log \circ g)^*(r)$$

Def.:  $g : \mathbb{N} \rightarrow \mathbb{N}$  "nice"

$$g^\diamond(r) = \begin{cases} 0 & \text{if } r \leq 1 \\ 1 + g^\diamond(\lceil \log_2 g(r) \rceil) & \text{if } n > 1 \end{cases}$$

Note:  $g^\diamond = (\lceil \log_2 \rceil \circ g)^*$

## Shifting Lemma:

Assume  $k \geq 0$ ,  $g: \mathbb{N} \rightarrow \mathbb{N}$ , "nice", non-decreasing,  $g(r) < r$   
for  $r > 0$ .

## Shifting Lemma:

Assume  $k \geq 0$ ,  $g: \mathbb{N} \rightarrow \mathbb{N}$ , "nice", non-decreasing,  $g(r) < r$   
for  $r > 0$ .

If

$$f(m, n, r) \leq k \cdot m + 2 \cdot n \cdot g(r) \quad \text{for all } m, n, r$$

## Shifting Lemma:

Assume  $k \geq 0$ ,  $g: \mathbb{N} \rightarrow \mathbb{N}$ , "nice", non-decreasing,  $g(r) < r$   
for  $r > 0$ .

If

$$f(m, n, r) \leq k \cdot m + 2 \cdot n \cdot g(r) \quad \text{for all } m, n, r$$

then also

$$f(m, n, r) \leq (k+1) \cdot m + 2 \cdot n \cdot g^\diamond(r) \quad \text{for all } m, n, r$$

Def:  $J_0(r) = \lceil (r-1)/2 \rceil$

$$J_k(r) = J_{k-1}^\diamond(r) \quad \text{for } k > 0$$

Def:  $J_0(r) = \lceil (r-1)/2 \rceil$

$J_k(r) = J_{k-1}^\diamond(r)$  for  $k > 0$

Lemma: For all  $k \in \mathbb{N}$

$$f(m, n, r) \leq km + 2nJ_k(r)$$

Def:  $J_0(r) = \lceil (r-1)/2 \rceil$

$$J_k(r) = J_{k-1}^\diamond(r) \quad \text{for } k > 0$$

Lemma: For all  $k \in \mathbb{N}$

$$f(m, n, r) \leq km + 2nJ_k(r)$$

Def:  $\alpha(m, n) = \min\{ k \in \mathbb{N} \mid J_k(\lfloor \log_2 n \rfloor) \leq 1 + m/n \}$

Note:  $r \leq \lfloor \log_2 n \rfloor$  always



Def:  $J_0(r) = \lceil (r-1)/2 \rceil$

$J_k(r) = J_{k-1}^\diamond(r)$  for  $k > 0$

Lemma: For all  $k \in \mathbb{N}$

$$f(m, n, r) \leq km + 2nJ_k(r)$$

Def:  $\alpha(m, n) = \min\{ k \in \mathbb{N} \mid J_k(\lfloor \log_2 n \rfloor) \leq 1 + m/n \}$

$$\alpha(m, n) = \min\{ k \in \mathbb{N} \mid J_0^{\overbrace{\diamond \diamond \dots \diamond}^{k \text{ times}}}(\lfloor \log_2 n \rfloor) \leq 1 + m/n \}$$

Def:  $J_0(r) = \lceil (r-1)/2 \rceil$

$J_k(r) = J_{k-1}^\diamond(r)$  for  $k > 0$

Lemma: For all  $k \in \mathbb{N}$

$$f(m, n, r) \leq km + 2nJ_k(r)$$

Def:  $\alpha(m, n) = \min\{ k \in \mathbb{N} \mid J_k(\lfloor \log_2 n \rfloor) \leq 1 + m/n \}$

$$\alpha(m, n) = \min\{ k \in \mathbb{N} \mid J_0^{\overbrace{\diamond \diamond \dots \diamond}^{k \text{ times}}}(\lfloor \log_2 n \rfloor) \leq 1 + m/n \}$$

Corollary:  $f(m, n, r) \leq (\alpha(m, n) + 2)m + 2n$

## Corollary:

Any sequence of  $m$  Union, Find operations in a universe of  $n$  elements that uses linking by rank and path compression takes time at most

$$O(m \cdot \alpha(m, n) + n)$$

Hopcroft - Ullman, Tarjan, van Leeuwen, Kozen,  
Harfst-Reingold;

Sharir

For  $r \leq 65$ :  $J_1(r) \leq 2$   
 $J_2(r) \leq 1$

$$f(m,n,r) \leq \min\{ m+4n, 2m+2n \} \text{ for } n < 2^{66}$$

For  $r \leq 65$ :  $J_1(r) \leq 2$   
 $J_2(r) \leq 1$

$$f(m,n,r) \leq \min\{ m+4n, 2m+2n \} \text{ for } n < 2^{66}$$

Actually:

$$f(m,n,r) \leq m+2.1n \quad \text{for } n < 2^{66}$$

$$f(m,n,r) \leq 2m+n \quad \text{for } n < 2^{2^{24615}}$$

Similar proof for  $O(m \cdot \alpha(m, n) + n)$  bound  
also works for

linking by weight and path compression

linking by rank and generalized path  
compaction

## Heuristic 2': Path compaction

when performin a **Find**(  $x$  ) operation make  
"all" nodes in the "findpath" child of some node  
further up.



## Heuristic 2': Path compaction

when performin a **Find**(  $x$  ) operation make  
"all" nodes in the "findpath" child of some node  
further up.





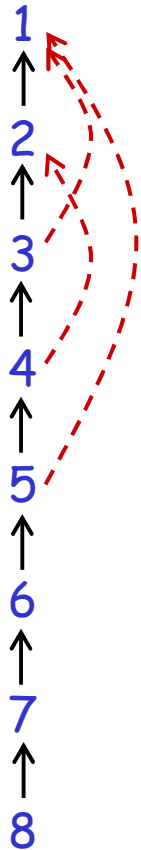
## Heuristic 2': Path compaction

when performin a **Find**(  $x$  ) operation make  
"all" nodes in the "findpath" child of some node  
further up.



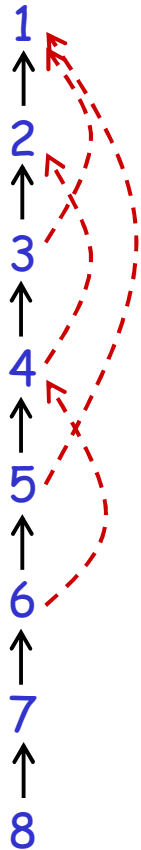
## Heuristic 2': Path compaction

when performin a **Find**(  $x$  ) operation make "all" nodes in the "findpath" child of some node further up.



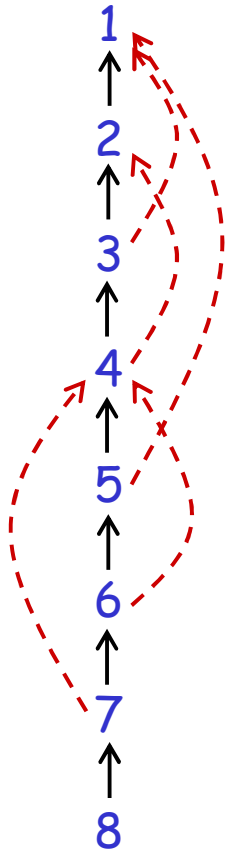
## Heuristic 2': Path compaction

when performin a **Find**(  $x$  ) operation make  
"all" nodes in the "findpath" child of some node  
further up.



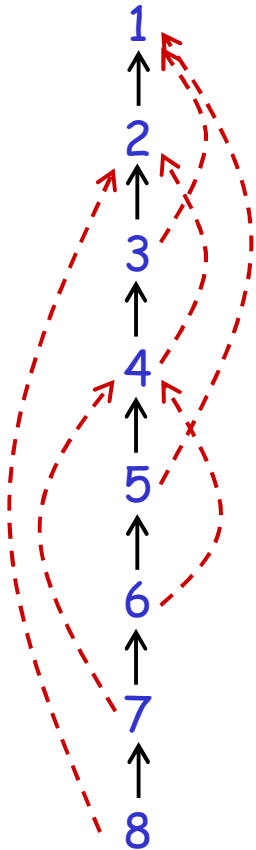
## Heuristic 2': Path compaction

when performin a **Find**(  $x$  ) operation make  
"all" nodes in the "findpath" child of some node  
further up.



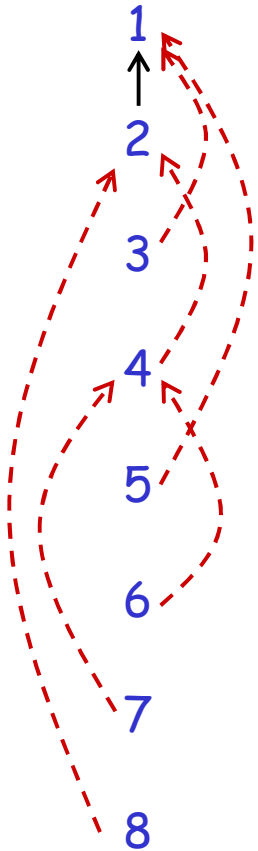
## Heuristic 2': Path compaction

when performin a **Find**(  $x$  ) operation make  
"all" nodes in the "findpath" child of some node  
further up.



## Heuristic 2': Path compaction

when performin a **Find**(  $x$  ) operation make  
"all" nodes in the "findpath" child of some node  
further up.



## Heuristic 2': Path compaction

when performin a **Find**(  $x$  ) operation make "all" nodes in the "findpath" child of some node further up.

