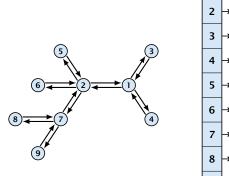
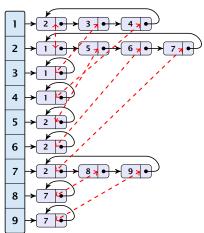
Tree Algorithms





Euler Circuits

Every node v fixes an arbitrary ordering among its adjacent nodes:

$$u_0, u_1, \ldots, u_{d-1}$$

We obtain an Euler tour by setting

$$\operatorname{succ}((u_i, v)) = (v, u_{(i+1) \bmod d})$$



Euler Circuits

Lemma 1

An Euler circuit can be computed in constant time $\mathcal{O}(1)$ with $\mathcal{O}(n)$ operations.



Rooting a tree

- split the Euler tour at node r
- this gives a list on the set of directed edges (Euler path)
- ▶ assign x[e] = 1 for every edge;
- perform parallel prefix; let $s[\cdot]$ be the result array
- if s[(u,v)] < s[(v,u)] then u is parent of v;



Postorder Numbering

- split the Euler tour at node r
- this gives a list on the set of directed edges (Euler path)
- ▶ assign x[e] = 1 for every edge (v, parent(v))
- ▶ assign x[e] = 0 for every edge (parent(v), v)
- perform parallel prefix
- ightharpoonup post(v) = s[(v, parent(v))]; post(r) = n



Level of nodes

- split the Euler tour at node r
- this gives a list on the set of directed edges (Euler path)
- ▶ assign x[e] = -1 for every edge (v, parent(v))
- ▶ assign x[e] = 1 for every edge (parent(v), v)
- perform parallel prefix
- level(v) = s[(parent(v), v)]; level(r) = 0



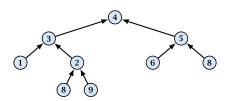
Number of descendants

- split the Euler tour at node r
- this gives a list on the set of directed edges (Euler path)
- ▶ assign x[e] = 0 for every edge (parent(v), v)
- ▶ assign x[e] = 1 for every edge $(v, parent(v)), v \neq r$
- perform parallel prefix
- ightharpoonup size(v) = s[(v, parent(v))] s[(parent(v), v)]



Given a binary tree T.

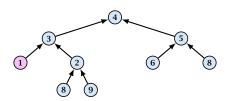
- remove u and p(u)
- attach sibling of u to p(p(u))





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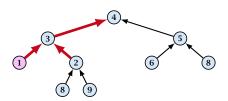
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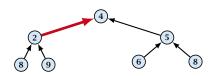
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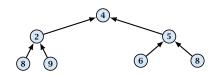
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Given a binary tree T.

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- attach sibling of u to p(p(u))





Possible Problems:

we could concurrently apply the rake-operation to two siblings

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- 2. we could concurrently apply the rake-operation to two leaves u and v such that p(u) and p(v) are connected



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- ▶ label leaves consecutively from left to right (excluding left-most and right-most leaf), and store them in an array *A*
- for $\lceil \log(n+1) \rceil$ iterations



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 - apply rake operation to remaining odd leaves (odd at start of round!!!)
 - A=even leaves



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Observations

- the rake operation does not change the order of leaves
- two leaves that are siblings do not perform a rake operation in the same round because one is even and one odd at the start of the round
- two leaves that have adjacent parents either have different parity (even/odd) or they differ in the type of child (left/right)



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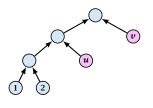


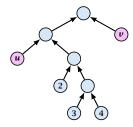
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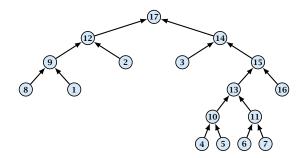


Cases, when the left edge btw. p(u) and p(v) is a left-child edge.

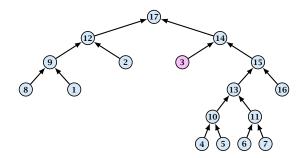




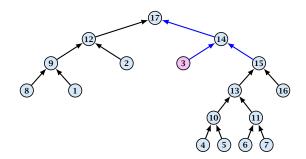




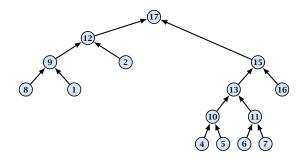




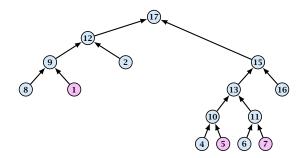




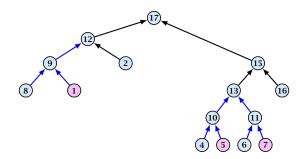




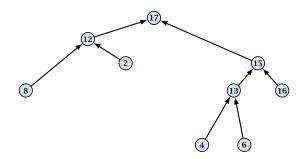




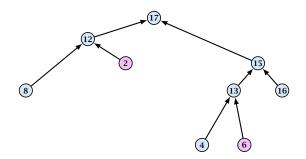




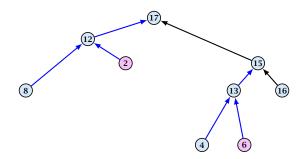




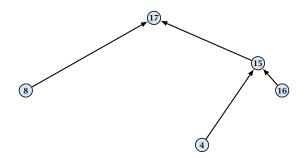




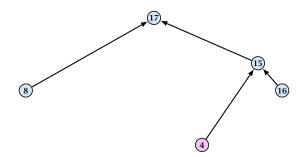




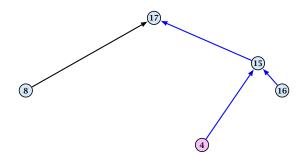




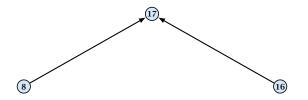




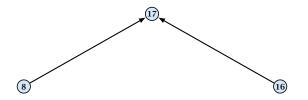














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- ▶ hence, all iterations can be performed in $\mathcal{O}(\log n)$ time and $\mathcal{O}(n)$ work;
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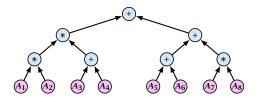


Suppose that we want to evaluate an expression tree, containing additions and multiplications.





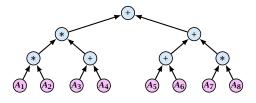
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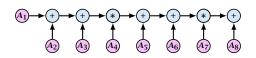






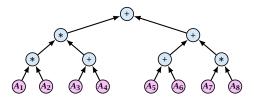
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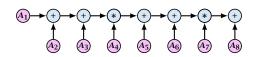






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Applying the rake-operation changes the tree.

In order to maintain the value we introduce parameters a_v and b_v for every node that still allows to compute the value of a node based on the value of its children.

Invariant:

Let u be internal node with children v and w. Then

$$val(u) = (a_v \cdot val(v) + b_v) \otimes (a_w \cdot val(w) + b_w)$$

where $\otimes \in \{*, +\}$ is the operation at node u.

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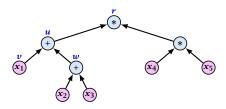
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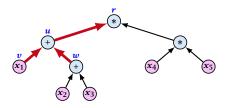
Currently the value at u is

 $val(u) = (a_u \cdot val(u) + b_u) + (a_w \cdot val(u) + b_w)$ $= v_1 + (a_u \cdot val(u) + b_w)$

In the expression for r this goes in as

 $a_{w} \cdot [x_1 + (a_w \cdot \text{val}(w) + b_w)] + b_w$





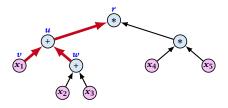
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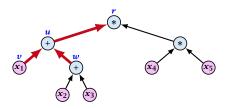
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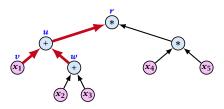


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$$= a_{0}a_{0} \cdot \text{val}(w) + a_{0}x_{1} + a_{0}b_{0} + b_{1}x_{2}$$





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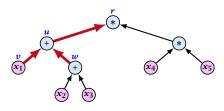
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$$a_w \cdot [x_1 + (a_w \cdot \operatorname{val}(w) + b_w)] + b_w$$

$$= \underbrace{a_n a_m}_{b'} \cdot \text{val}(m) + \underbrace{a_n x_1 + a_n b_m + b_n}_{b'}$$





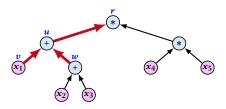
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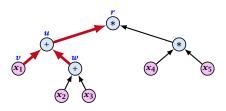


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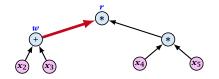
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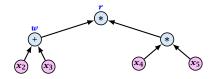
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$$a_{u} \cdot [x_{1} + (a_{w} \cdot \text{val}(w) + b_{w})] + b_{u}$$

$$= \underbrace{a_{u}a_{w}}_{a'_{w}} \cdot \text{val}(w) + \underbrace{a_{u}x_{1} + a_{u}b_{w} + b_{u}}_{b'_{w}}$$



If we change the a and b-values during a rake-operation according to the previous slide we can calculate the value of the root in the end.

Lemma 2

We can evaluate an arithmetic expression tree in time $O(\log n)$ and work O(n) regardless of the height or depth of the tree.

By performing the rake-operation in the reverse order we can also compute the value at each node in the tree.



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Lemma 3

We compute tree functions for arbitrary trees in time $O(\log n)$ and a linear number of operations.

proof on board...

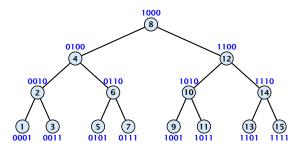


In the LCA (least common ancestor) problem we are given a tree and the goal is to design a data-structure that answers LCA-queries in constant time.



Least Common Ancestor

LCAs on complete binary trees (inorder numbering):

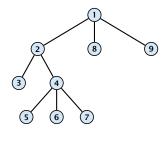


The least common ancestor of u and v is

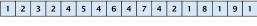
$$z_1 z_2 \dots z_i 10 \dots 0$$

where z_{i+1} is the first bit-position in which u and v differ.

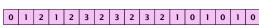
Least Common Ancestor



nodes



levels





 $\ell(v)$ is index of first appearance of v in node-sequence.

r(v) is index of last appearance of v in node-squence.

 $\ell(v)$ and r(v) can be computed in constant time, given the node- and level-sequence.



Least Common Ancestor

Lemma 4

- **1.** u is ancestor of v iff $\ell(u) < \ell(v) < r(u)$
- **2.** u and v are not related iff either $r(u) < \ell(v)$ or $\ell(u) < r(v)$
- **3.** suppose $r(u) < \ell(v)$ then LCA(u, v) is vertex with minimum level over interval $[r(u), \ell(v)]$.



Range Minima Problem

Given an array A[1...n], a range minimum query (ℓ,r) consists of a left index $\ell \in \{1,...,n\}$ and a right index $r \in \{1,...,n\}$.

The answer has to return the index of the minimum element in the subsequence $A[\ell \dots r].$

The goal in the range minima problem is to preprocess the array such that range minima queries can be answered quickly (constant time).



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Given an algorithm for solving the range minima problem in time T(n) and work W(n) we can obtain an algorithm that solves the LCA-problem in time $\mathcal{O}(T(n) + \log n)$ and work $\mathcal{O}(n + W(n))$.

Remark

In the sequential setting the LCA-problem and the range minima problem are equivalent. This is not necessarily true in the parallel setting.



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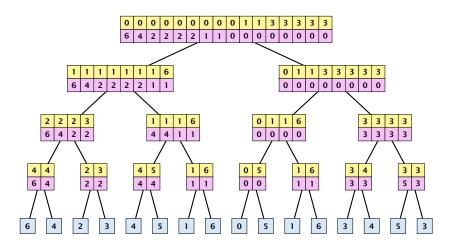
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Prefix and Suffix Minima

Tree with prefix-minima and suffix-minima:







- Suppose we have an array A of length $n = 2^k$
- ightharpoonup We compute a complete binary tree T with n leaves.
- ► Each internal node corresponds to a subsequence of *A*. It contains an array with the prefix and suffix minima of this subsequence.

Given the tree T we can answer a range minimum query (ℓ, r) in constant time.

- we can determine the LCA x of ℓ and x in constant time since T is a commlete binary tree.
- Then we consider the suffix minimum of ℓ in the left child
- of x and the prefix minimum of x in the right child of x.
- The minimum of these two values is the result.



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Lemma 5

We can solve the range minima problem in time $O(\log n)$ and work $O(n\log n)$.



Partition A into blocks B_i of length $\log n$

Preprocess each B_i block separately by a sequential algorithm so that range-minima queries within the block can be answered in constant time. (how?)

For each block B_i compute the minimum $oldsymbol{x}_i$ and its prefix and suffix minima.

Use the previous algorithm on the array $(x_1, ..., x_{n/\log n})$



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Use the previous algorithm on the array $(x_1, \dots, x_{n/\log n})$.



Answering a query (ℓ, r) :

- if ℓ and r are from the same block the data-structure for this block gives us the result in constant time
- if ℓ and r are from different blocks the result is a minimum of three elements:
 - ullet the suffix minmum of entry ℓ in ℓ 's block
 - the minimum among $x_{\ell+1}, \ldots, x_{r-1}$
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