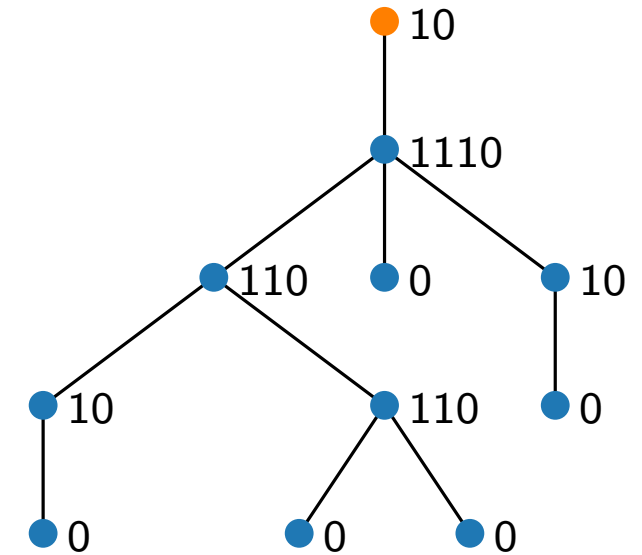
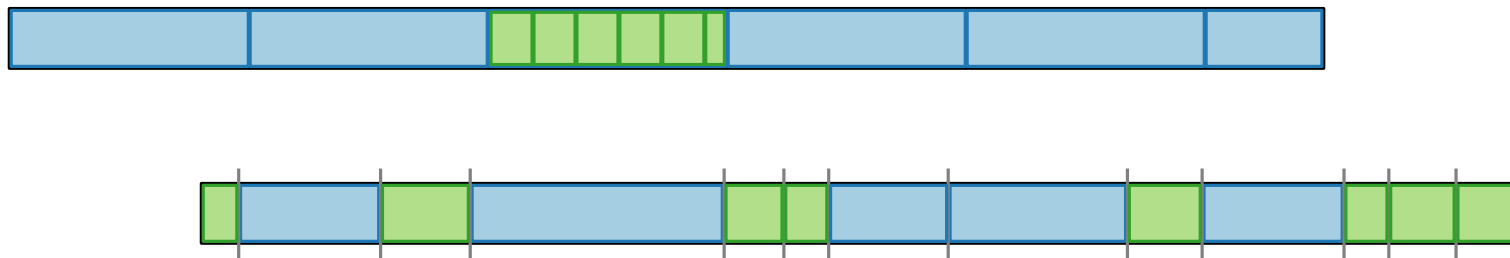


Advanced Algorithms

Succinct Data Structures

Indexable Dictionaries and Trees



Data Structures – Informal Definition

A **data structure** is a concept to

- **store**,
- **organize**, and
- **manage** data.

⇒

As such, it is a collection of

- **data values**,
- their **relations**, and
- the **operations** that can be applied to the data.

- What do we represent?
- How much space is required?
- Dynamic or static?
- Which operations are defined?
- How fast are they?

Remarks.

- We look at data structures as a designer/implementer (and not necessarily as a user).
- To define a data structure and to implement it are two different tasks.

Succinct Data Structures

Goal.

- Use space “close” to information-theoretical minimum,
- but still support time-efficient operations.

Let L be the information-theoretical lower bound to represent a class of objects.

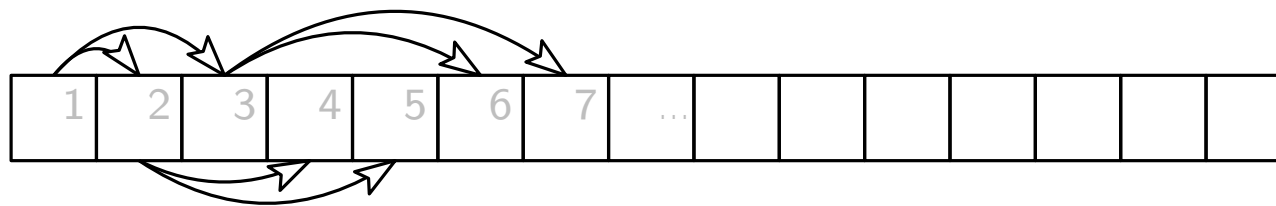
Then a data structure that supports time-efficient operations is called

- **implicit** – if it uses $L + O(1)$ bits of space;
- **succinct** – if it uses $L + o(L)$ bits of space;
- **compact** – if it uses $O(L)$ bits of space.

Examples?

Examples for **Implicit** Data Structures

- **arrays** to represent lists
 - but why not linked lists?
- **1-dim arrays** to represent multi-dimensional arrays
- **sorted arrays** to represent sorted lists
 - but why not binary search trees?
- **arrays** to represent complete binary trees and heaps



$$\text{leftChild}(i) = 2i$$

$$\text{rightChild}(i) = 2i + 1$$

$$\text{parent}(i) = \lfloor \frac{i}{2} \rfloor$$

And unbalanced
trees?

Succinct Indexable Dictionary

Represent a subset $S \subseteq \{1, 2, \dots, n\}$ and support the following operations in $O(1)$ time:

- $\text{member}(i)$ returns true iff $i \in S$
- $\text{rank}(i)$ = number of elements in S that are at most i
- $\text{select}(j)$ = j -th smallest element in S
- $\text{predecessor}(i)$
- $\text{successor}(i)$

How many different subsets of $\{1, 2, \dots, n\}$ are there? 2^n

How many bits of space do we need to distinguish them?

$$\log 2^n = n \text{ bits}$$

our logarithms are all base 2, i.e., $\log_2$

Succinct Indexable Dictionary

Represent S with a bit vector b of length n where

$$b[i] = \begin{cases} 1 & \text{if } i \in S \\ 0 & \text{otherwise} \end{cases}$$

plus $o(n)$ -space data structures to answer in $O(1)$ time

- $\text{rank}(i) = \# \text{ 1s at or before position } i$
 - $\text{select}(j) = \text{position of } j\text{-th 1 (from the left)}$
- number of
- Exercise: Use these methods to answer predecessor(i) and successor(i) in $O(1)$ time.

$S = \{3, 4, 6, 8, 9, 14\}$ where $n = 15$

	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15
b	0	0	1	1	0	1	0	1	1	0	0	0	0	1	0

$\text{select}(5) = 9$

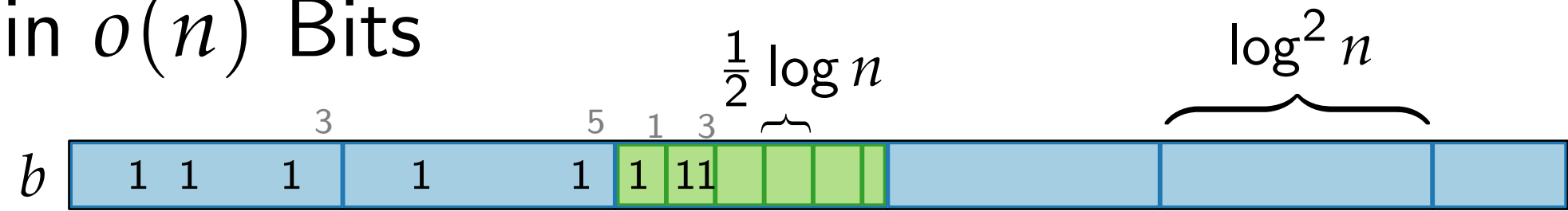
$\text{rank}(9) = 5 = \text{rank}(12)$

$\text{rank}(15) = 6$

$\text{member}(i)$ can trivially be answered in $O(1)$ time
(assuming that we can access any entry in constant time)

Rank in $o(n)$ Bits

$$\log^2 n = (\log n)^2$$



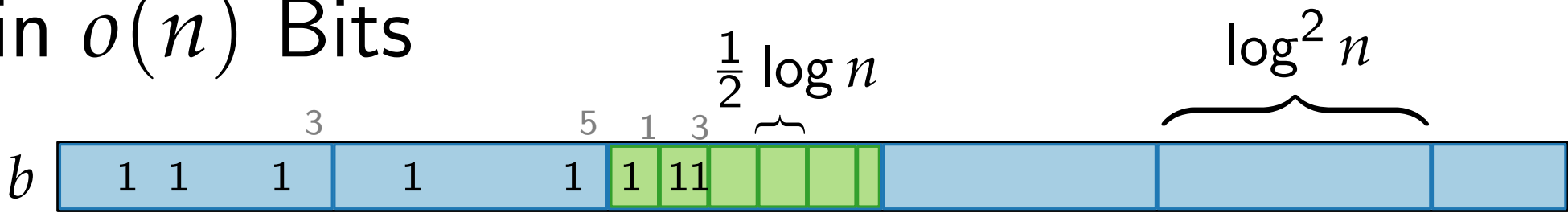
1. Split into $(\log^2 n)$ -bit **chunks**
 and store cumulative rank: each needs $\leq \log n$ bits

$$\Rightarrow O\left(\underbrace{\frac{n}{\log^2 n}}_{\text{\# subchunks}} \underbrace{\log n}_{\text{rel. rank}}\right) = O\left(\frac{n}{\log n}\right) \subseteq o(n) \text{ bits}$$
2. Split **chunks** into $(\frac{1}{2} \log n)$ -bit **subchunks**
 and store cumulative rank within **chunk**: each needs $\leq \log \log^2 n = 2 \log \log n$ bits

$$\Rightarrow O\left(\underbrace{\frac{n}{\log n}}_{\text{\# subchunks}} \underbrace{\log \log n}_{\text{rel. rank}}\right) \subseteq o(n) \text{ bits}$$

Rank in $o(n)$ Bits

$\log^2 n = (\log n)^2$



1. Split and

Example: $n = 64 \Rightarrow \frac{1}{2} \log n = 3$

position $\rightarrow$	1	2	3
000	0	0	0
001	0	0	1
010	0	1	1
011	0	1	2
100	1	1	1
101	1	1	2
110	1	2	2
111	1	2	3

2. Split and

s $\leq \log n$ bits

$O(\frac{n}{\log^2 n} \log n) = O(\frac{n}{\log n}) \subseteq o(n)$ bits

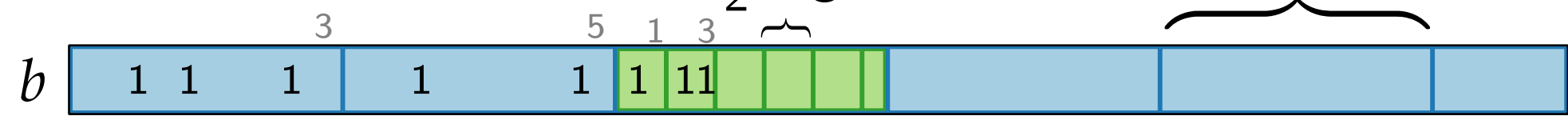
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each needs $\leq \log \log^2 n = 2 \log \log n$ bits
 $\Rightarrow O(\frac{n}{\log n} \log \log n) \subseteq o(n)$ bits

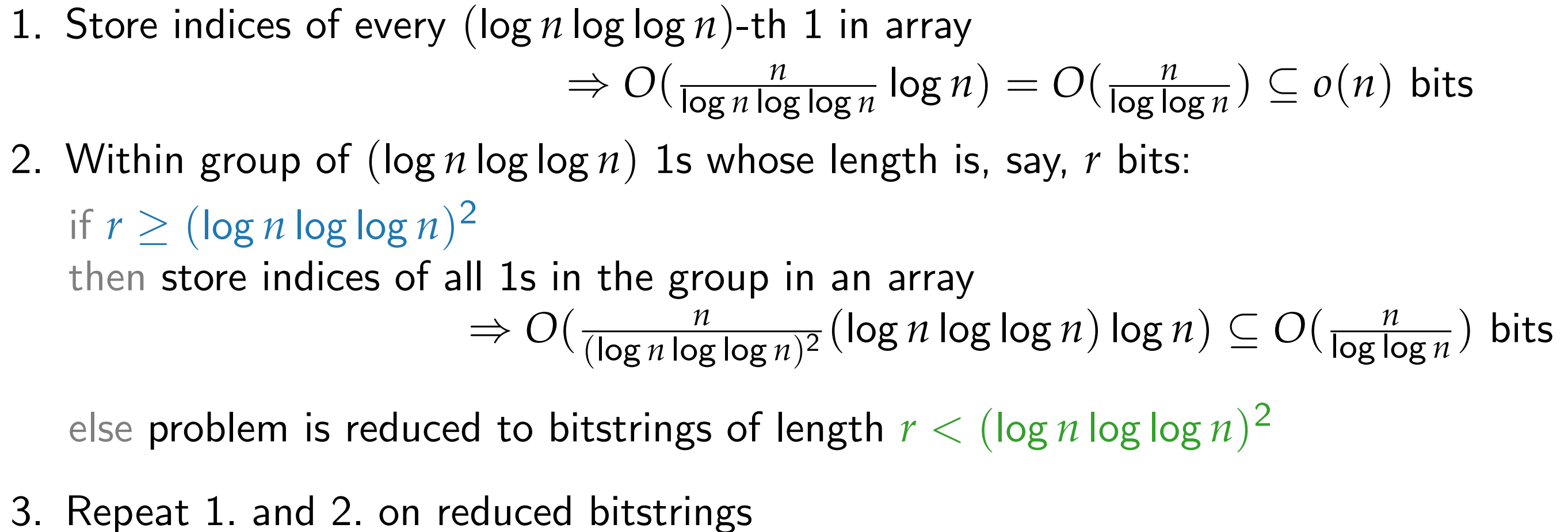
3. Use **lookup table** for bitstrings of length $(\frac{1}{2} \log n)$: $2^{\frac{1}{2} \log n} = \sqrt{n}$ distinct bitstrings
 $\Rightarrow O(\underbrace{\sqrt{n}}_{\# \text{ rows}} \underbrace{\log n}_{\# \text{ columns}} \underbrace{\log \log n}_{\text{rel. rank}}) \subseteq o(n)$ bits

Rank in $o(n)$ Bits + $O(1)$ Time

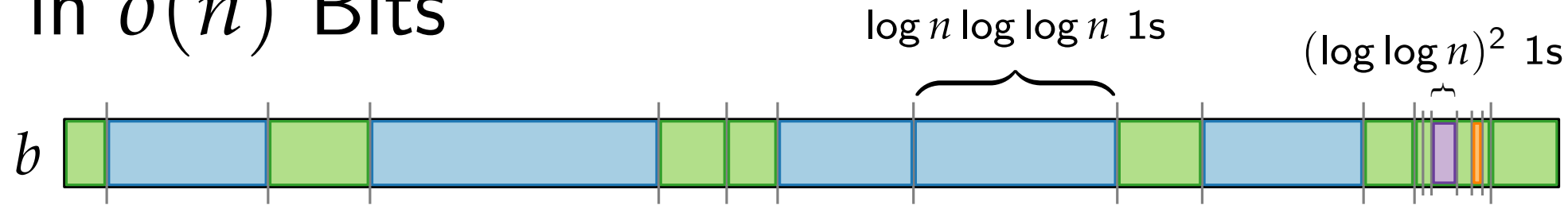
$$\log^2 n = (\log n)^2$$



1. Split into $(\log^2 n)$ -bit **chunks**
 and store cumulative rank: each needs $\leq \log n$ bits
 $\Rightarrow O(\frac{n}{\log^2 n} \log n) = O(\frac{n}{\log n}) \subseteq o(n)$ bits
2. Split **chunks** into $(\frac{1}{2} \log n)$ -bit **subchunks**
 and store cumulative rank within **chunk**: each needs $\leq \log \log^2 n = 2 \log \log n$ bits
 $\Rightarrow O(\frac{n}{\log n} \log \log n) \subseteq o(n)$ bits
3. Use **lookup table** for bitstrings of length $(\frac{1}{2} \log n)$: $2^{\frac{1}{2} \log n} = \sqrt{n}$ distinct bitstrings
 $\Rightarrow O(\sqrt{n} \log n \log \log n) \subseteq o(n)$ bits
4. $\text{rank}(i) = \text{rank of chunk}$
 + relative rank of **subchunk** within **chunk** $\Rightarrow O(1)$ time
 + relative rank of element i within **subchunk** (assume read/write numbers in $O(1)$ time)



Select in $o(n)$ Bits



3. Repeat 1. and 2. on reduced bitstrings ($r < (\log n \log \log n)^2$):

1' Store relative indices of every $(\log \log n)^2$ -th 1 in array

$$\Rightarrow O\left(\frac{n}{(\log \log n)^2} \log \log n\right) = O\left(\frac{n}{\log \log n}\right) \text{ bits}$$

2' Within subgroup of $(\log \log n)^2$ 1s whose length is, say, r' bits:

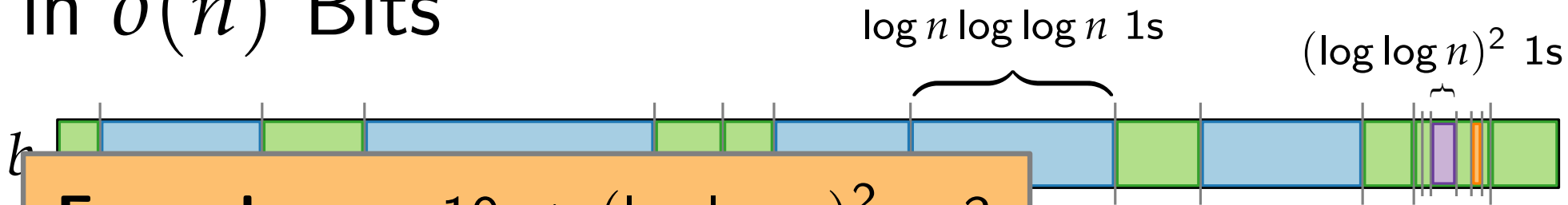
if $r' \geq (\log \log n)^4$

then store relative index of every 1 in the subgroup in an array.

$$\Rightarrow O\left(\frac{n}{(\log \log n)^4} (\log \log n)^2 \log \log n\right) = O\left(\frac{n}{\log \log n}\right) \text{ bits}$$

else problem is reduced to bitstrings of length $r' < (\log \log n)^4$

Select in $o(n)$ Bits



Example: $n = 10 \Rightarrow (\log \log n)^2 \approx 3$
 $\Rightarrow r' < (\log \log n)^4 \approx 9$

select $\rightarrow$		1	2	3
bitstring	00000111	6	7	8
	00001011	5	7	8
	00001101	5	6	8
	$\vdots$			
	11001000	1	2	5
	11010000	1	2	4
	11100000	1	2	3

3. Repeat

1' Store

2' With

if r'

then

$(n \log \log n)^2$:

1 in array

$(n)^2 \log \log n) = O(\frac{n}{\log \log n})$ bits

length is, say, r' bits:

group in an array.

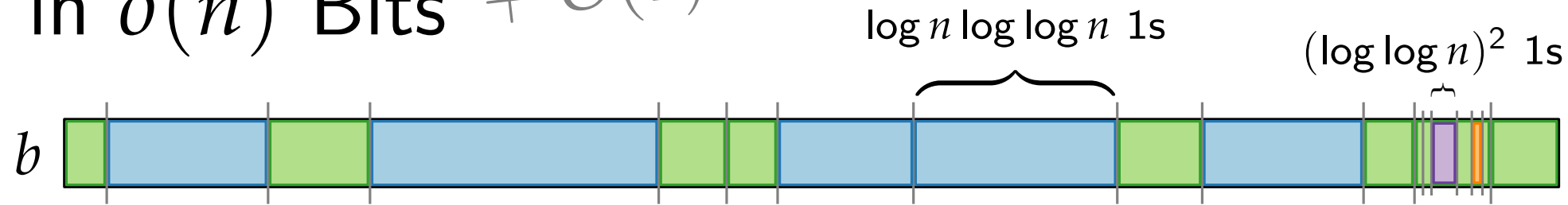
$(n)^2 \log \log n) = O(\frac{n}{\log \log n})$ bits

else problem is reduced to bitstrings of length $r' < (\log \log n)^4$

4. Use **lookup table** for bitstrings of length $r' \leq (\log \log n)^4$:

$$\underbrace{2^{(\log \log n)^4}}_{\# \text{ rows}} \in O(2^{\frac{1}{2} \log n}) = O(\sqrt{n}); \quad \underbrace{(\log \log n)^2}_{\# \text{ columns}} \in O(\log n) \Rightarrow \underbrace{O(\sqrt{n})}_{\# \text{ rows}} \underbrace{\log n}_{\# \text{ columns}} \underbrace{\log \log n}_{\text{rel. index}} = o(n) \text{ bits}$$

Select in $o(n)$ Bits + $O(1)$ Time



4. $\text{select}(j) = \text{select } J\text{-th group where } J = \lfloor j / (\log n \log \log n) \rfloor$

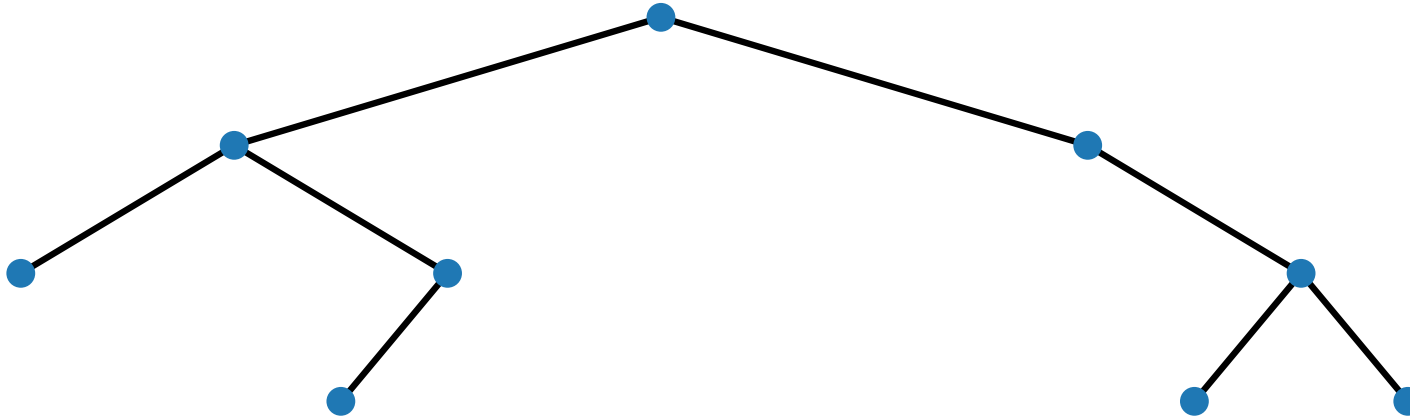
+ directly select $(j - J)$ -th 1

or select J' -th subgroup where $J' = \lfloor (j - J) / (\log \log n)^2 \rfloor$

+ directly select $(j - J - J')$ -th 1

or select it in the lookup table

Succinct Representation of Binary Trees



C_n is the n -th *Catalan number* and $C_0 = 1$

Number of binary trees on n vertices: $C_n = \sum_{i=0}^{n-1} C_i \cdot C_{n-1-i} = \frac{(2n)!}{(n+1)!n!}$

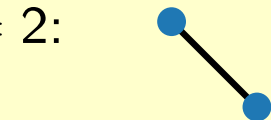
$n = 0$: "empty tree"

1 possibility

$n = 1$:

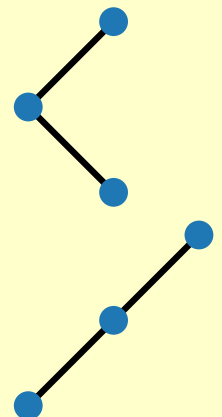
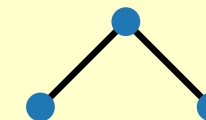
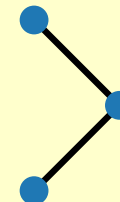
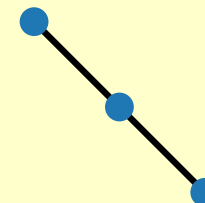
1 possibility

$n = 2$:



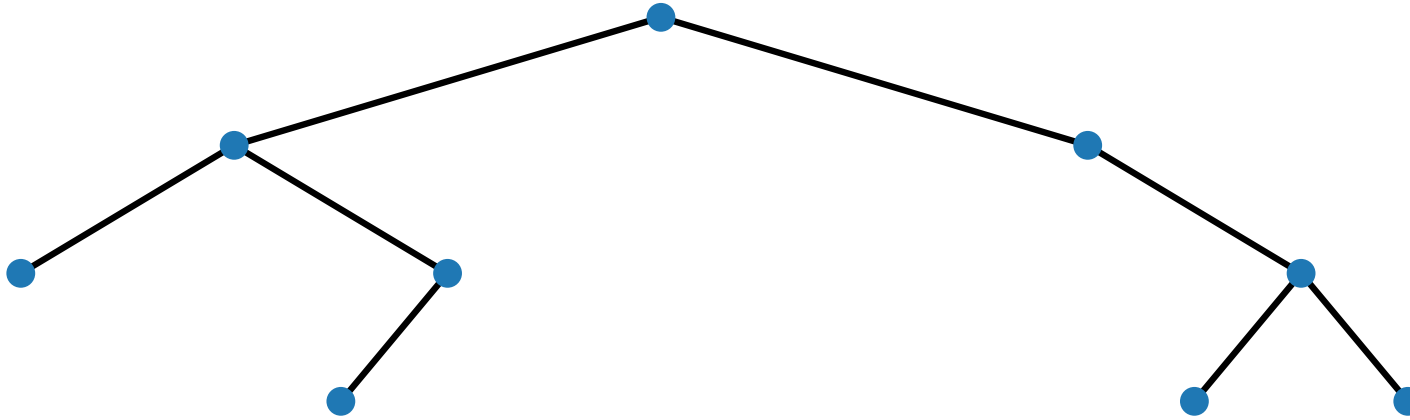
2 possibilities

$n = 3$:



5 possibilities

Succinct Representation of Binary Trees



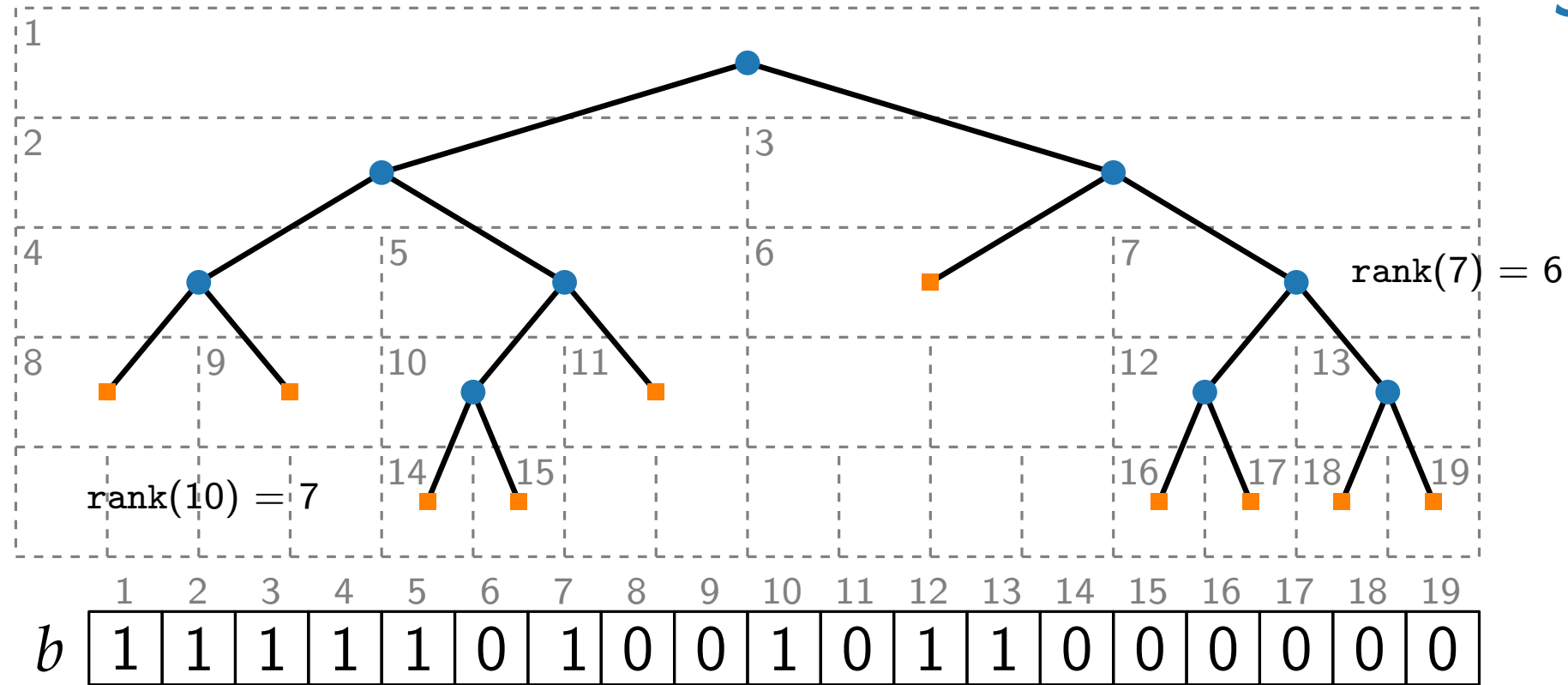
Number of binary trees on n vertices: $C_n = \sum_{i=0}^{n-1} C_i \cdot C_{n-1-i} = \frac{(2n)!}{(n+1)! n!}$

$\log C_n = 2n + o(n)$ (by Stirling's approximation)

$\Rightarrow$ We can use $2n + o(n)$ bits to represent binary trees.

Difficulty is when a binary tree is not full.

Succinct Representation of Binary Trees



Size.

- $2n + 1$ bits for b
- $o(n)$ for rank and select

Idea.

- Add **external** nodes to have out-degree 2 or 0 at every node
- Read **internal** nodes as 1
- Read **external** nodes as 0
- Use rank and select

Operations.

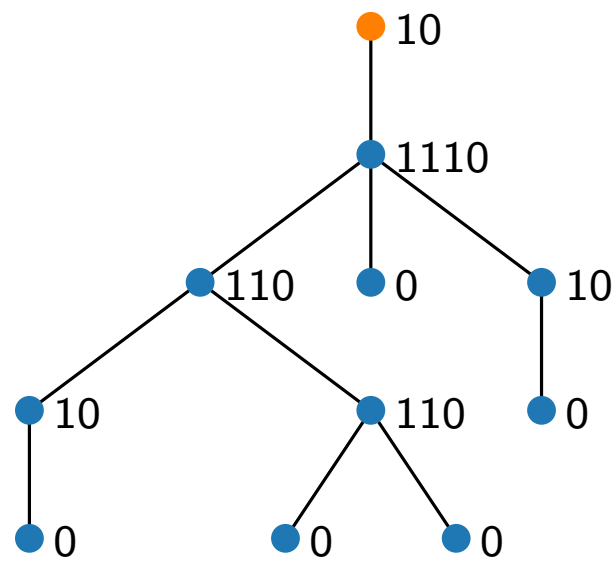
- $\text{parent}(i) = \text{select}(\lfloor \frac{i}{2} \rfloor)$
- $\text{leftChild}(i) = 2 \text{ rank}(i)$
- $\text{rightChild}(i) = 2 \text{ rank}(i) + 1$
- $\text{rank}(i)$ is index for array storing actual values

Proof is exercise.

Succinct Representation of Trees – LOUDS

[Level Order Unary Degree Sequence]

- add extra root with out-degree 1
- unary encoding of out-degree terminated by a 0
- gives LOUDS sequence



1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21
1	0	1	1	1	0	1	1	0	0	1	0	1	0	1	1	0	0	0	0	0

Size.

- each vertex (except root) is represented twice, namely with a 1 and with a 0

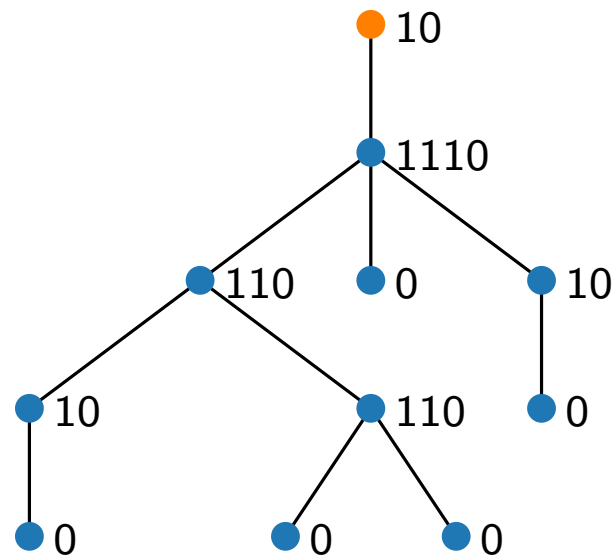
$$\Rightarrow 2n + o(n) \text{ bits}$$

- $o(n)$ bits for rank and select

Succinct Representation of Trees – LOUDS

[Level Order Unary Degree Sequence]

- add extra root with out-degree 1
- unary encoding of out-degree terminated by a 0
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1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21
1	0	1	1	1	0	1	1	0	0	1	0	1	0	1	1	0	0	0	0	0

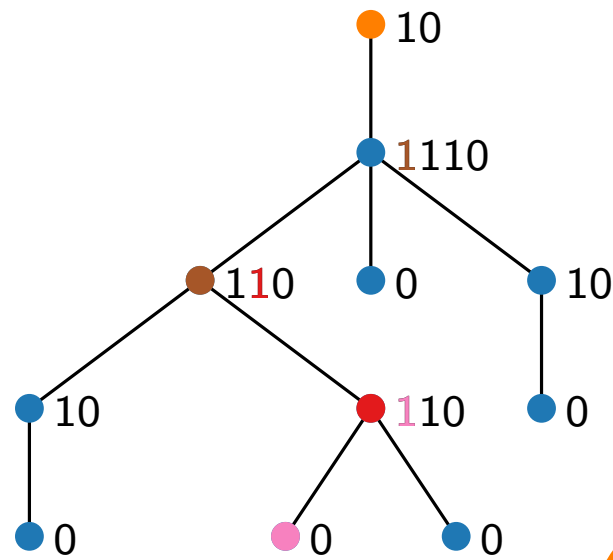
Operations.

- Let i be index of 1 in LOUDS sequence.
This 1 represents a node (e.g. first 1 represents the root).
- $\text{rank}(i)$ is index for array storing actual values of the nodes.

Succinct Representation of Trees – LOUDS

[Level Order Unary Degree Sequence]

- add extra root with out-degree 1
- unary encoding of out-degree terminated by a 0
- gives LOUDS sequence



1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21
1	0	1	1	1	0	1	1	0	0	1	0	1	0	1	1	0	0	0	0	0
1	0	1	1	1	0	1	1	0	0	1	0	1	0	1	1	0	0	0	0	0

execute $\text{select}(j)$ on the 0s instead of the 1s

execute $\text{rank}(i)$ on the 1s (as before)

■ $\text{firstChild}(i) = \text{select}_0(\text{rank}_1(i)) + 1$

$\text{firstChild}(8) = \text{select}_0(\text{rank}_1(8)) + 1$
 $= \text{select}_0(6) + 1 = 14 + 1 = 15$

■ $\text{nextSibling}(i) = i + 1$

■ $\text{parent}(i) = \text{select}_1(\text{rank}_0(i))$

$\text{parent}(8) = \text{select}_1(\text{rank}_0(8))$
 $= \text{select}_1(2) = 3$

Exercise: $\text{child}(i, j)$
with validity check

Discussion

- Succinct data structures are
 - space efficient
 - support fast operationsbut
 - are mostly static (dynamic at extra cost),that is, insertions & deletions
 - number of operations is limited,
 - complex $\rightarrow$ harder to implement,
 - the $o(n)$ and $O(1)$ terms hide constants that may dominate before any asymptotic advantage over the “best” compact data structures becomes apparent.
 - $\rightarrow$ primarily a theoretical result (also does not consider hardware architecture)
- rank and select form the basis for many succinct representations (e.g., for specific types of trees or strings).
- There are implementations of succinct data structures being used in practice for large data sets in information retrieval, language model representation, bioinformatics, etc.

Literature

Main reference:

- Lecture 17 of Advanced Data Structures (MIT, Fall'17) by Erik Demaine
- [Jacobson 1989] “Space efficient Static Trees and Graphs”

Recommendations:

- Lecture 18 of Demaine's course on compact & succinct arrays & trees