

# Run-Time Analysis

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**Run-time Analysis** allows us to formalize a method of comparing the speed of an algorithm as the size of input grows.

## Array

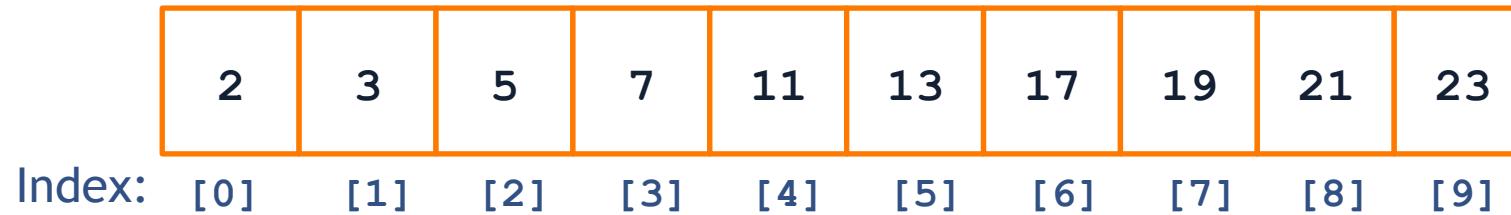


## List



# Example:

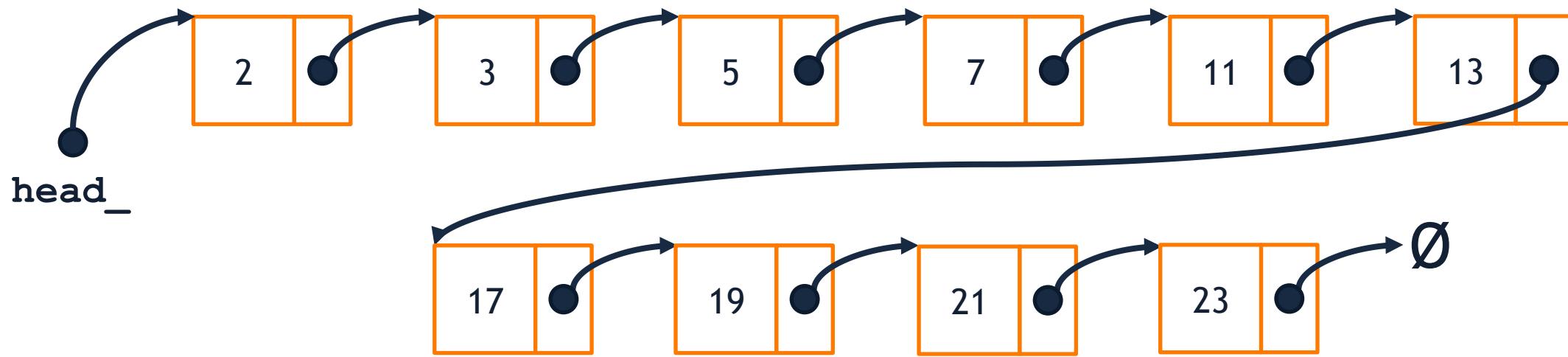
**Objective:** Access a given index.



Calculate offset (= `sizeof(data type) * index`) to find index, so it is  $O(1)$

# Example:

**Objective:** Access a given index.



Need to travel through the list to find index, so it is  $O(n)$

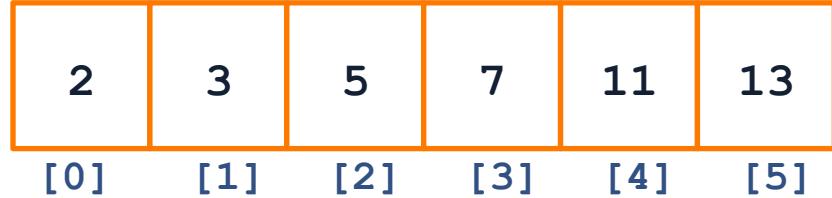
# Objective: Access a given index:

	Array	Linked List
Access [3]		
Access [4285]		
Access [1250000]		
Based on $n$ pieces of data:		

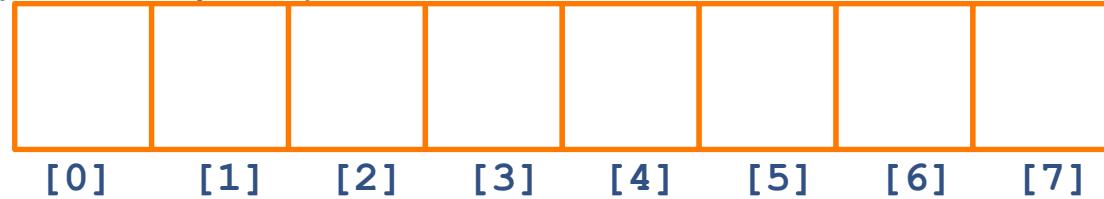
# Array Resize Strategy

**Objective:** Resize an array:

Array with capacity=6:



Array with capacity=8:



# Strategy #1: When the array is full, add two to the capacity.

Resize #    Array / Number of Copies



...



...where  $r = n/2$

# Strategy #1: When the array is full, add two to the capacity.

Resize #    Array / Number of Copies



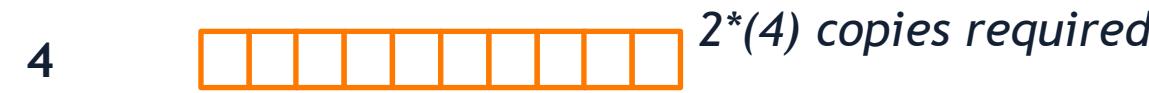
...

$r = n/2$     ...     $2^{*(r-1)} \text{ copies required}$

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# Strategy #1: When the array is full, add two to the capacity.

Resize #    Array / Number of Copies



...

$r = n/2$        ...    *2\*(r) copies required*

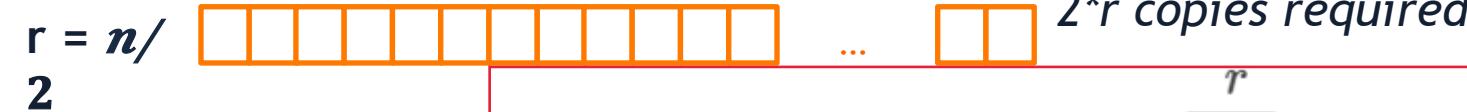
# Strategy #1: When the array is full, add two to the capacity.

Resize #    Array / Number of Copies



...

...



*Sum of all required copies:* 
$$\sum_{k=1}^r (2k) = 2 \cdot \left( \frac{r(r+1)}{2} \right) = r^2 + r$$

# Strategy #1: When the array is full, add two to the capacity.

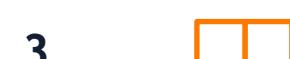
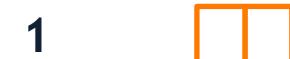
- We have found two equations:
  - Total number of copies:  $r^{\lceil 2} + r$
  - Relationship between  $r$  and  $n$ :  $r=n/2$

- Therefore, the total number of copies made:

$$\begin{array}{ccccccccc} r^{\lceil 2} + r & = & (n/2)^{\lceil 2} + n/2 & = & n^{\lceil 2} + 2n/4 & = \\ O(n^{\lceil 2}) & & \text{Substituting } (n/2) \text{ in place of } r & & \text{Expanding the exponent and simplifying} & & \text{Using Big-O notation} \\ \boxed{O(n^2)} & & & & & & & \end{array}$$

## Strategy #2: When the array is full, double the capacity.

Resize #    Array / Number of Copies



...

$r = \lg(n)$



...



$2^{r+1}$  copies required

# Strategy #2: When the array is full, double the capacity.

Resize #    Array / Number of Copies

0		
1		$2^{11} = 2 \text{ copies required}$
2		$2^{12} = 4 \text{ copies required}$
3		$2^{13} = 8 \text{ copies required}$
4		$2^{14} = 16 \text{ copies}$ req. $\cdot ?d$
...		$2^{1r} \text{ copies required}$
$r = \lg(n)$		...
		

*Sum of all required copies:*

$$\sum_{k=1}^{r} 2^k = 2 * (2^r - 1)$$

Solving the summation

## Strategy #2: When the array is full, **double** the capacity.

- We have found two equations:
  - Total number of copies:  $2*(2^r - 1)$
  - Relationship between  $r$  and  $n$ :  $r = \lg(n)$

- Therefore, the total number of copies made:

$$\begin{array}{c} 2(2^r - 1) \\ \hline O(n) \end{array} = \begin{array}{c} 2(2^{\lg n} - 1) \\ \text{Substituting } \lg(n) \text{ in place of } r \end{array} = \begin{array}{c} 2(2^{\lg(n)} - 1) \\ 2^{\lg(n)} \text{ simplifies to } n \end{array} = \begin{array}{c} 2(n-1) \\ \text{Using Big-O notation} \end{array}$$

# Array Resize Strategy

**Objective:** Resize an array

- Strategy #1 (grow array by +2 each time):
  - Total work done by adding n elements:  $O(n^2)$
- Strategy #2 (double array each time):
  - Total work done by adding n elements:  $O(n)$
  - Average work per element:  $O(n) / n == O(1)^*$ 
    - \* Amortized running time; some operations take longer.

# Objective: Access a given index:

	Array	Linked List
Access [3]	1 formula	Visits 4 ListNodes
Access [4285]	1 formula	Visits 4,285 ListNodes
Access [1250000]	1 formula	Visits 1,250,000 ListNodes
Based on $n$ pieces of data:	1 formula	Visits up to $n$ ListNodes

# Run-time Analysis

- Run-time Analysis allows us to formalize a method of comparing the speed of an algorithm as the size of input grows.
- We summarize the runtime in “Big-O notation”, leaving only the term that dominates the growth:
  - $O(1)$ , constant time
  - $O(n)$ , linear time
  - $O(n^2)$ , polynomial time

