

# Discussion 2

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[visualising data structures and algorithms through animation - VisuAlgo](#)

## Agenda

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- Asymptotic notation
  - definition
  - Algorithmic Common Runtimes
  - Analyzing Runtime examples
  - a little taste of formal proof
- homework 1
  - data structures to implement
  - the `optional` type
  - Google Test

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## Asymptotic notation

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### Definitions

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- $T(n)$ : run time of the function for  $n \in \mathbb{N}$  denote the size of input
- $O$ : asymptotic **upper** bound
- $\Omega$  (Omega): asymptotic **lower** bound
- $\Theta$  (Theta): asymptotic **tight** bound

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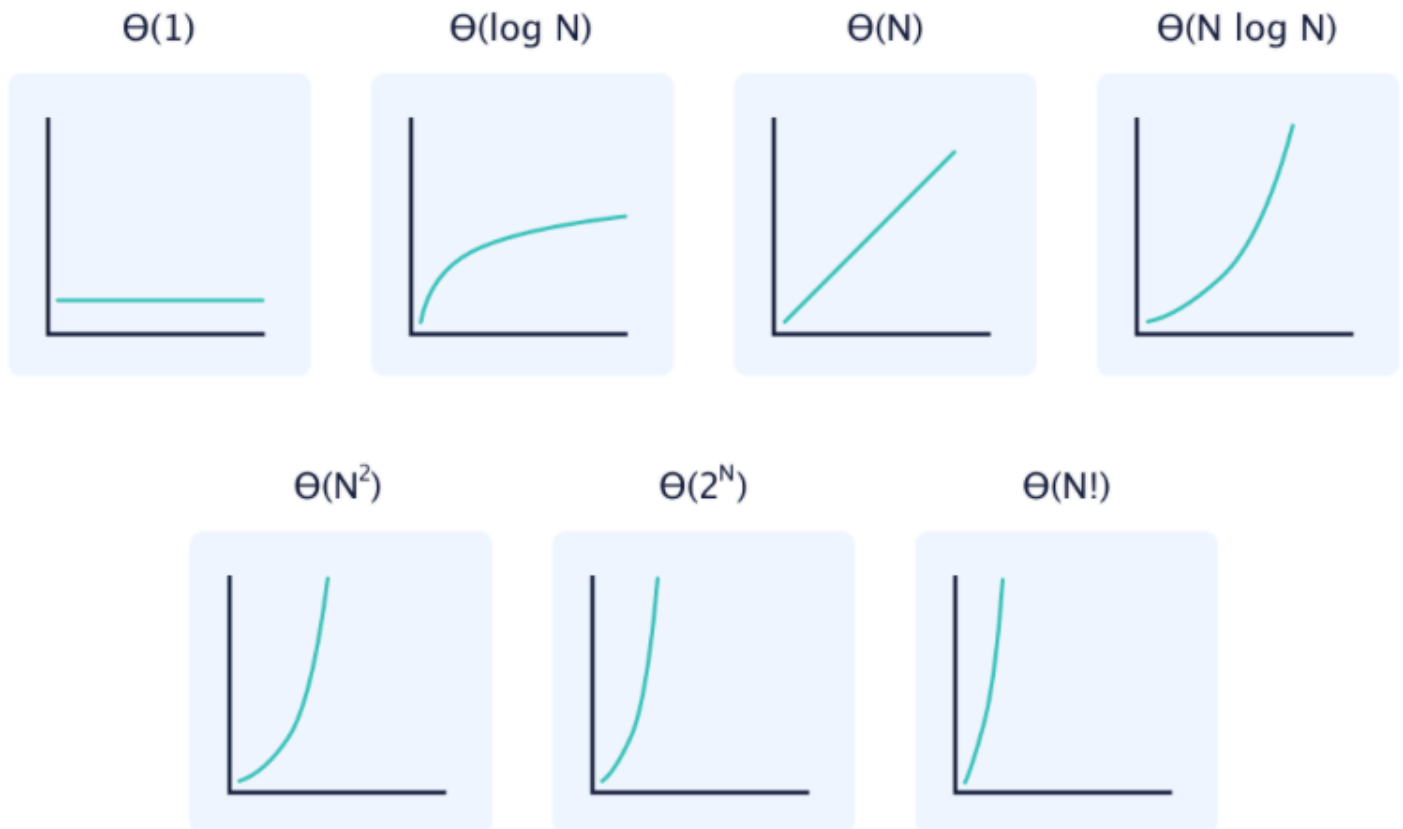
### Algorithmic Common Runtimes

The common algorithmic runtimes from fastest to slowest:

- constant:  $\Theta(1)$ 
  - Accessing an element of an array by index.
  - Basic arithmetic operations (e.g., addition, subtraction).
  - Checking if a data structure is empty.
- logarithmic:  $\Theta(\log N)$ 
  - Binary Search: Finding an element in a sorted array by repeatedly dividing the search interval in half.

- Balanced Binary Search Trees (e.g., AVL trees): Operations like insertion and deletion take  $O(\log n)$  time because the tree remains balanced.
- linear:  $\Theta(N)$ 
  - Linear Search: Finding an element in an unsorted array by checking each element one by one.
  - Summing the elements of an array.
- polynomial:  $\Theta(N^2)$ 
  - Bubble Sort: Repeatedly steps through the list, compares adjacent elements, and swaps them if they are in the wrong order.
- exponential:  $\Theta(2^N)$
- factorial:  $\Theta(N!)$

## Common Runtimes



## O-notation

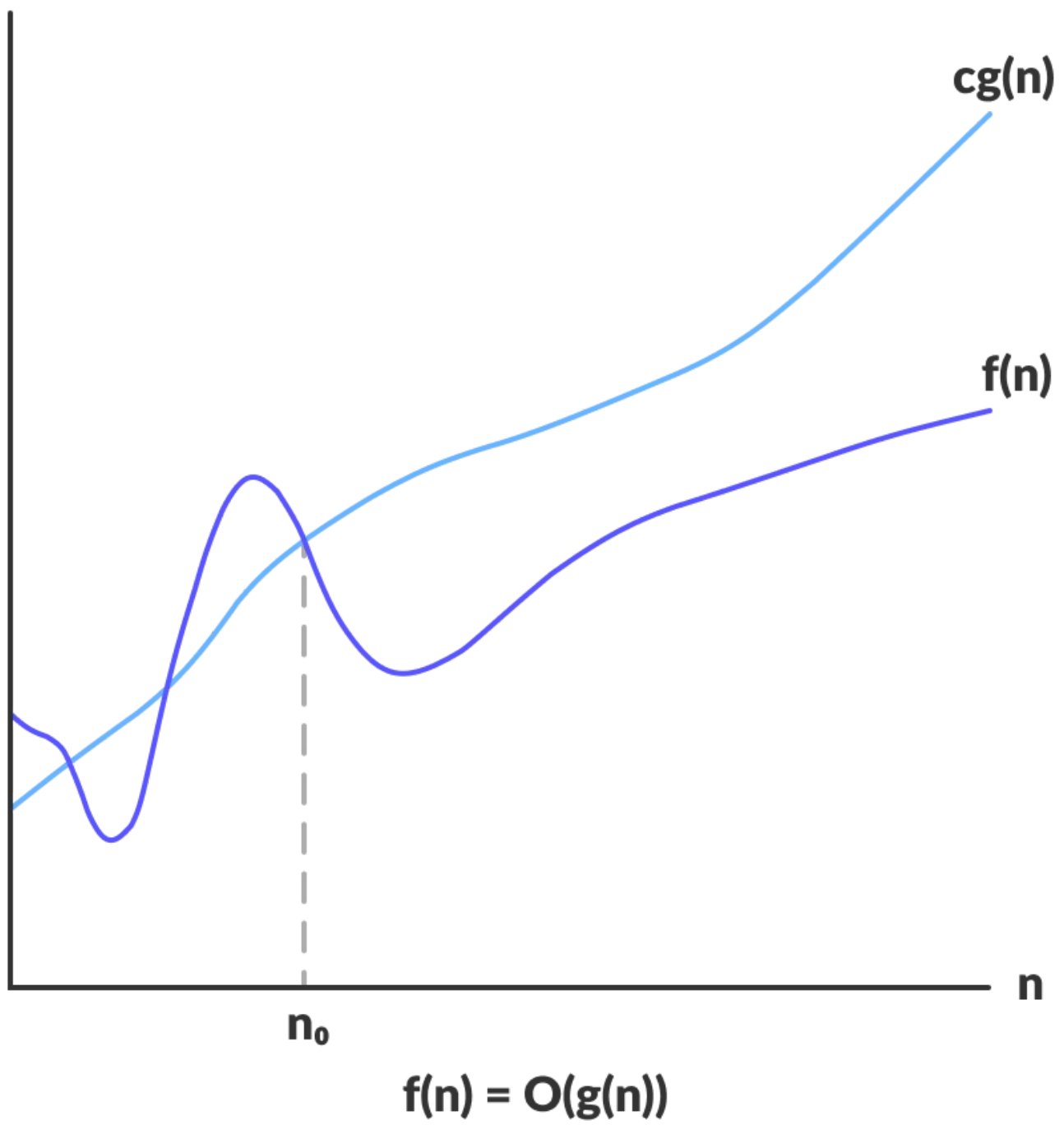
**Defn** for given function  $g(n)$ , if there exists constant  $c > 0$  and  $n_0 \in \mathbb{N}$  such that for all  $n \geq n_0$ ,  $O(g(n)) = f(n) : 0 \leq f(n) \leq cg(n)$ .

In other words,  $f(n)$  is  $O(g(n))$  if  $f(n) \leq cg(n)$  for some  $c$  and sufficiently large  $n$ .

Another way of explanation:

- We want to use a function  $g(n)$  to emulate/approach the algorithm function  $f(n)$ .
- $c, n$  are positive constant

```
O(g(n)) = { f(n): there exist positive constants c and n0
             such that 0 ≤ f(n) ≤ cg(n) for all n ≥ n0 }
```



Analyzing Runtime

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# factorial

```
def factorial(x: Int) -> Int:
  if x == 1
    return 1
  return x * factorial(x - 1)
```

Calculating time bound for recursive algorithms

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$$\begin{aligned}T(n) &= T(n-1) + c \\&= T(n-2) + c + c \\&\dots \\&= T(1) + (n-1)c \in O(n)\end{aligned}\tag{1}$$

## Proving upper bound

Recall the definition,

there exists constant  $c > 0$  and  $n_0 \in \mathbb{N}$  such that ...

Find these constants! Find the  $c, n_0$ . *Proof* (factorial is  $O(n)$ ).

For  $T(n) = T(1) + (n-1)c_1$ ,

Let  $c_2 = c_1 + 1$  and  $n_0 = 1$ , then  
for any  $n \geq n_0$ , we have

$$T(n) = (n-1)c_1 \leq nc_2\tag{2}$$

thus  $T(n) \in O(n)$ .

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## selection sort

```
def sort(xs: [a]) -> [a]:
  for i in [1..n]
    key = xs[i]
    for j in [i..n]
      swap(xs, i, j)
  return xs
```

Calculating time bound directly

$$T(n) = n \times n + n = n^2 + n \in O(n^2). \quad (3)$$

## linked list search (hw1)

```
def search(head: LinkedListNode<a>, v: a) -> bool:
    ptr = head
    while (ptr is not null)
        if ptr.value == v:
            return true
        ptr = ptr.next
    return false
```

## Optional Quick Sort

```
def qsort(xs: [a]) -> [a]:
    pivot = some element in xs
    left = [x | x in xs, x < pivot]
    right = [x | x in xs, x > pivot]
    return qsort(left) ++ [x] ++ qsort(right)
```

For best case partitioning,

$$\begin{aligned} T(n) &= 2T(n/2) + n + c \\ &= 2(2T(n/4) + n/2) + \dots \implies \frac{n}{2^k} = 1 \implies k = \log_2 n \\ &\dots \\ &= 2^k T(n/(2^k)) + kn + c \end{aligned} \quad (4)$$

$$\implies T(n) = 2^{\log_2 n} T(1) + \log_2 n \cdot n = n + n \log n \in O(n \log n) \quad (5)$$

## Proving not an upper bound

*Proof* (quick sort is not  $O(n)$ ).

Basic idea: Select a contradiction.

$$T(n) = n + n \log n.$$

Suppose  $T(n) \in O(n)$ , then there exists some  $c, n_0 > 0$  such that for all  $n \geq n_0$ ,

$$n + n \log n < cn$$

$$\begin{aligned}
 n + n \log n &\leq cn \\
 \implies n \log n &\leq (c-1)n \\
 \implies \log n &\leq c-1
 \end{aligned}
 \tag{6}$$

Choose  $n \geq 2^c$ , then

$$\log_2 2^c = c \leq \log_2 n \leq c-1 \tag{7}$$

which is a contradiction.

Thus the time complexity of quick sort cannot be  $O(n)$ .

# Homework 1

## Linked List Node

```

template <typename T>
class LinkedListNode
{
private:
    // make constructors and `_next` field only available to `LinkedList` class
    // to avoid instantiating node and mutating `_next` outside `LinkedList` class.

    template <typename U>
    friend class LinkedList;

    LinkedListNode<T> *_next;

    explicit LinkedListNode(T value) : value(value), _next(nullptr) {}
    LinkedListNode(T value, LinkedListNode<T> *next) : value(value), _next(next) {}

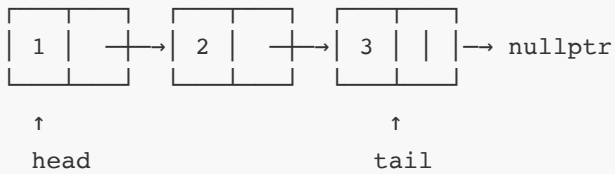
public:
    T value;
    LinkedListNode<T> *next() { return _next; }
};

```

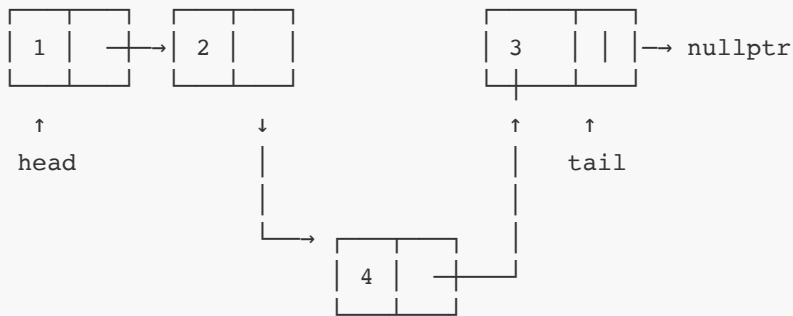
this definition is provided in [lib/LinkedListNode.hpp](#).

## Linked List Insert

Linked list:

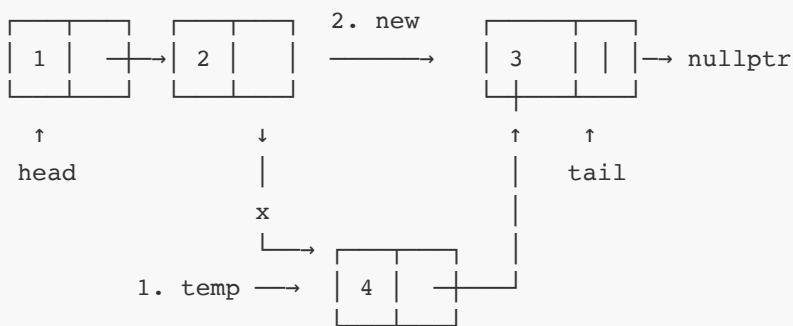


add a node 4 after node 2



## Linked List Remove

deleting node



what to do next?

**Remember to free your heap memory!**

```
delete temp;
```

**`std::optional` manages an *optional* contained value**



```

/// @brief remove the first element from the list
/// @return the value of head it just removed
T removeHead();

```

what's wrong? The current list **maybe** empty, then what should it return?

```
data Maybe a = Just a | Nothing
```

If a operation may fail, the return type of the function should be its desired type **or** nothing.

In out case, `removeHead()` should return Just a value of type `T` or nothing, so

```

/// @brief remove the first element from the list
/// @return the removed element if there was at least one element in the list;
///         std::nullopt otherwise
std::optional<T> removeHead();

```

## Sum/union Type

In general, viewing types as sets,  
we can say a **union type** is the union of these types,  
so a instance of the union type can be of any type in that union.

```

def square(number: int | float) -> int | float:
    return number ** 2

```

## GoogleTest

A unit testing framework for C++ (and other languages).

running tests for `hw1`

```

> mkdir build
> cd build
> cmake ..
> make
> ./run_tests
Running main() from /ECS36C/hw1/build/_deps/googletest-src/googletest/src/gtest_main.cc
[-----] 1 test from QueueTest (0 ms total)

[-----] Global test environment tear-down
[-----] 24 tests from 2 test suites ran (0 ms total)

```

```
[-----] 24 tests from 5 test suites ran. (0 ms total)
[ PASSED   ] 22 tests.
[ FAILED   ] 2 tests, listed below:
[ FAILED   ] StackTest.BadTest
[ FAILED   ] QueueTest.BadTest

2 FAILED TESTS
```

## Adding your new tests

suppose adding a new test for linked list

```
TEST(LinkedListTest, DoesSomething) {
    // init the linked list
    LinkedList<char> ll;
    ...
    ASSERT_EQ(do_something, its_rnt);
    ASSERT_NE(do_something, what_it_should_not_be)
    ...
}
```

to test other things,

- change name of test suite (`LinkedListTest`)
- init your object
- assert its behaviors