

Goals

- Describe functions and their properties
- Analyze complexity of simple algorithms
- Apply Big-O

Announcements

- Tea
- PA2 available

Due before Wed Class

- Survey
- Pre Quiz

Due Thurs:

- Self Grade / Reflection

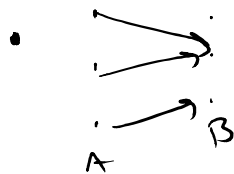
With group, review notes on functions from last week, come up with at least one question about functions.

To describe a function (formally):

- $f: A \rightarrow B$  (define domain and codomain)

- Describe mapping. For example

- $f(x) = \dots$



If clear from context, we will sometimes not explicitly state domain & codomain.

# Intro to Algorithm Complexity

Important function: worst case time complexity of an algorithm in C.S.

$$T: D \rightarrow \mathbb{N}, \text{ for } D \subseteq \mathbb{N}$$

↑  
input size

↖ # of operations performed by algorithm in worst case.

unless parallel computing, this tells you the time the computer will take to run the algorithm.  
Just multiply by time to do 1 operation

## Linear Search

• Input:  $(a_1, a_2, \dots, a_n), x$       ← Input size is  $n$

• Output:  $j$  if  $a_j = x$ , 0 otherwise

- 1)  $i = 1$
- 2) while  $(i \leq n \text{ and } x \neq a_i)$
- 3)      $i = i + 1$
- 4) if  $i \leq n$ :  
   return  $i$
- 5) else:  
   return 0

Q: What is  $T(n)$  for linear search? (Hint:  $n$  is not correct)

Report by  
By group.

Issues:

- too fine-grained / detailed
  - different computers might do operations differently
  - when  $n$  gets large, don't care about 100000 vs 100001
- too difficult to count every operation

## Big-O to Rescue!

↑  
special notation to describe how functions grow

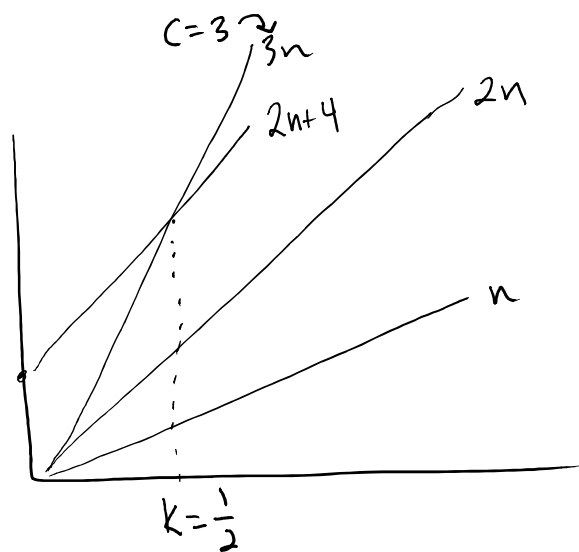
def: Let  $f, g: \mathbb{Z} \rightarrow \mathbb{R}^+$  or  $f, g: \mathbb{Z} \rightarrow \mathbb{N}$ ,

Then  $f(x)$  is  $O(g(x))$  if  $\exists k, c \in \mathbb{R} : \forall x \geq k,$

$$f(x) \leq c g(x).$$

" $f$  of  $x$  is big-oh of  $g$  of  $x$ "

ex:  $2n+4$  is  $O(n) \equiv \exists k, C \in \mathbb{R}: 2n+4 \leq Cn \quad \forall n \geq k$



(often use  $x, n$  as function inputs)

⇐ Not a proof.

Proof:

- For  $n \geq 1$ , we have  $4n \geq 4$ . (Multiply both sides by 4). Thus for  $n \geq 1$ ,  $2n+4 \leq 2n+4n = 6n$ , so  $2n+4 = O(n)$  with  $k=1, C=6$ .

- For  $n \geq 4$ , we have  $2n+4 \leq 2n+n = 3n$ , so  $2n+4 = O(n)$  with  $k=4, C=3$ .

Infinitely many combos of  $k, C$  work. To prove, you need to find ONE combo.

General trick: try to get  $f(x)$  to look like  $g(x)$  by turning bad terms into good terms.

Above  $4 \rightarrow 4n$  or  $4 \rightarrow n$

Q: Prove other functions for linear search # of operations is  $O(n)$

Starting to see why big-O is good for algorithm time complexity:

- Small differences in how you calculate don't matter
- Not too fine grained

However big-O is only upper bound:

ex:  $7x+1$  is  $O(x^2)$

Pf: We have  $7x+1 \leq 7x+x$  for all  $x \geq 1$

Then  $7x+x = 8x \leq x^2$  for all  $x \geq 8$

Thus with  $k=8$ ,  $C=1$ ,  $7x+1 = O(x^2)$

Q: Prove  $10x^2$  is not  $O(x)$ . This means  
 There do not exist constants  $k, C$ , such that  $10x^2 < Cx$   
 $\forall x \geq k$ .

Pf: For contradiction, assume  $k, C$  exist. Then  $\forall x \geq k$ ,  
 we have

$$10x^2 \leq Cx$$

When  $x > 0$ , we have  $x \leq \frac{C}{10}$ . Thus, this inequality  
 holds only when  $0 < x \leq \frac{C}{10}$ , which contradicts  
 that it should hold for all  $x \geq k$ .