


Lecture 14: Asymptotic Growth

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Proof Techniques

- Theorem:
There exists a polygon with four sides.
- Proof:



It is a polygon.
It has four sides.
QED.

What kind of proof is this?

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Proof by Construction

- We can prove a “there exists an X with property Y ” theorem, but showing an X that has property Y
- $O(f)$ means “**there are** positive constants c and n_0 such that $g(n) \leq cf(n)$ **for all** $n \geq n_0$ ”
- So, to prove g is in $O(f)$ we need to find c and n_0 and show that $g(n) \leq cf(n)$ **for all** $n \geq n_0$

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Dis-Proof by Construction

- To prove g is **not** in $O(f)$:
- $O(f)$ means: **there are** positive constants c and n_0 such that $g(n) \leq cf(n)$ **for all** $n \geq n_0$
- So, to prove g is **not** in $O(f)$ we need to find a way given **any** c and n_0 to find an $n \geq n_0$ such that $g(n) > cf(n)$.

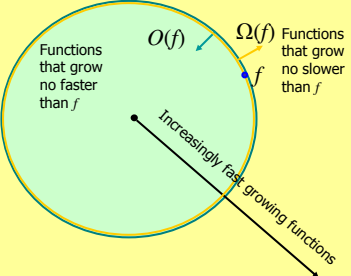
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Growth Notations

- $g \in O(f)$ (“Big-Oh”)
 - g grows **no faster than** f (upper bound)
- $g \in \Theta(f)$ (“Theta”)
 - g grows **as fast as** f (tight bound)
- $g \in \Omega(f)$ (“Omega”)
 - g grows **no slower than** f (lower bound)

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The Sets $O(f)$ and $\Omega(f)$



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O and Ω Examples

g is in $O(f)$ iff there are positive constants c and n_0 such that $g(n) \leq cf(n)$ for all $n \geq n_0$.

g is in $\Omega(f)$ iff there are positive constants c and n_0 such that $g(n) \geq cf(n)$ for all $n \geq n_0$.

- n is in $\Omega(n)$
 - Yes, pick $c = 1$
- $10n$ is in $\Omega(n)$
 - Yes, pick $c = 1$
- Is n^2 in $\Omega(n)$?
 - Yes! (pick $c = 1$)
- n is in $O(n)$
 - Yes, pick $c = 1$
- $10n$ is in $O(n)$
 - Yes, pick $c = 10$
- n^2 is **not** in $O(n)$
 - Pick $n > c$

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Example

- Is n in $\Omega(n^2)$?
 - $n \geq cn^2$ for all $n \geq n_0$
 - $1 \geq cn$ for all $n \geq n_0$

No matter what c is, I can make this false by using $n = (1/c + 1)$

g is in $\Omega(f)$ iff there are positive constants c and n_0 such that $g(n) \geq cf(n)$ for all $n \geq n_0$.

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Θ (“Theta”): Tight Bound

g is $\Theta(f)$ iff

g is in $O(f)$
and g is in $\Omega(f)$

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The Sets $O(f)$, $\Omega(f)$, and $\Theta(f)$

How big are $O(f)$, $\Omega(f)$, and $\Theta(f)$?

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Θ Examples

- Is $10n$ in $\Theta(n)$?
 - Yes, since $10n$ is $\Omega(n)$ and $10n$ is in $O(n)$
 - Doesn't matter that you choose different c values for each part; they are independent
- Is n^2 in $\Theta(n)$?
 - No, since n^2 is not in $O(n)$
- Is n in $\Theta(n^2)$?
 - No, since n is not in $\Omega(n^2)$

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Sorting Cost

- What grows?
 - n = the number of elements in list
- How much work are the pieces?
 - find-best: work scales as n (increases by one)
 - delete: work scales as n (increases by one)
- How many times does sort evaluate find-best and delete? n
- Total cost: scales as n^2

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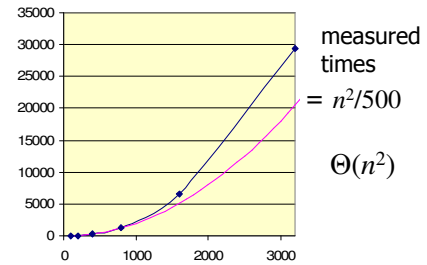
Sorting Cost

```
(define (sort lst cf)
  (if (null? lst) lst
      (let ((best (find-best lst cf)))
        (cons best (sort (delete lst best) cf))))))
(define (find-best lst cf)
  (if (= 1 (length lst)) (car lst)
      (pick-better cf (car lst) (find-best (cdr lst) cf))))
```

If we double the length of the list, the amount of work *approximately* quadruples: there are twice as many applications of find-best, and each one takes twice as long

The running time of this sort procedure is in $\Theta(n^2)$

Timing Sort



Is our sort good enough?

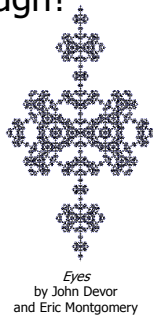
Takes over 1 second to sort 1000-length list. How long would it take to sort 1 million items?

1s = time to sort 1000
4s ~ time to sort 2000

1M is $1000 * 1000$

Sorting time is n^2
so, sorting 1000 times as many items will take
 1000^2 times as long = 1 million seconds ~ 11 days

Note: there are 800 Million VISA cards in circulation.
It would take 20,000 years to process a VISA transaction at this rate.



Which of these is true?

- ~~Our sort procedure is too slow for VISA because its running time is in $\mathcal{O}(n^2)$~~
- Our sort procedure is too slow for VISA because its running time is in $\Omega(n^2)$
- Our sort procedure is too slow for VISA because its running time is in $\Theta(n^2)$

Knowing a running time is in $\mathcal{O}(f)$ tells you the running time is not *worse* than f . This can *only* be good news. It doesn't tell you anything about how bad it is. (Lots of people and books get this wrong.)

Charge

- Read Chapter 6 and 7 of the course book
- PS4 is due Monday