
Algorithms II, CS 502

Algorithms Basics

Ugur Dogrusoz

Computer Eng Dept, Bilkent Univ

What is an Algorithm?

- Procedure that **always halts** with a **correct solution** to the problem at hand

Why study Algorithms?

- Analyze performance to determine “feasible vs. not”
- Algorithmic mathematics (e.g. big-O notation) allows comparing performance of two algorithms for the same problem
- Build a repertoire of algorithms for future use
- Learn various algorithm design paradigms and apply to new problems

Kinds of analyses

■ Worst case (usually):

- $T(n)$ = maximum time it takes for an algorithm for **any** input of size n

■ Average case (sometimes):

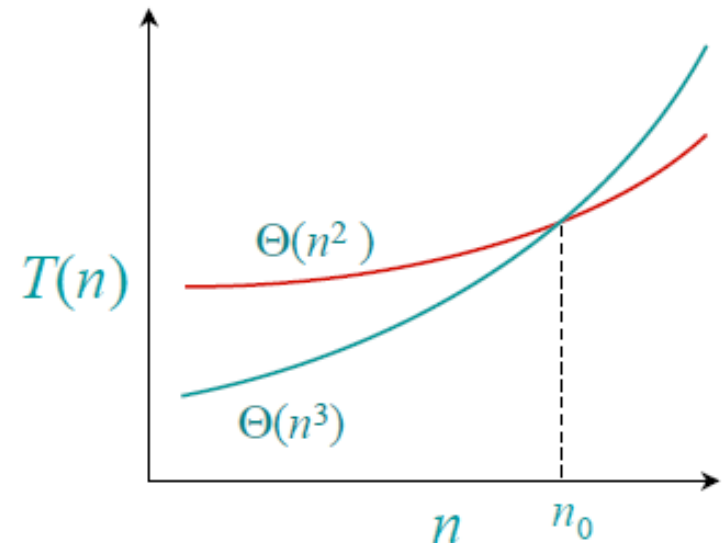
- $T(n)$ = expected time of algorithm **over all** inputs of size n
- Need to know statistical distribution of inputs
- Harder

■ Best case (rarely):

- Can always cheat with a slow algorithm that works fast on **some** input

Asymptotic notation

- Use for running time or memory requirement analysis
- Ignore machine-dependent constants, look at growth in $T(n)$ as n goes to infinity
- When input size gets large enough, a quadratic algorithm always beats a cubic one



O-notation

■ Formally

$O(g(n)) = \{f(n) : \text{there exist positive constants } c \text{ and } n_0 \text{ such that } 0 \leq f(n) \leq cg(n) \text{ for all } n \geq n_0\}.$

■ Informally

- drop low order terms, ignore leading constants to form an **upper** bound

$$3n^3 + 90n^2 - 5n + 6046 = O(n^3)$$

Ω -notation

■ Formally

$\Omega(g(n)) = \{f(n) : \text{there exist positive constants } c \text{ and } n_0 \text{ such that } 0 \leq cg(n) \leq f(n) \text{ for all } n \geq n_0\}$.

■ Informally

- drop low order terms, ignore leading constants to form a **lower** bound

$$3n^3 + 90n^2 - 5n + 6046 = \Omega(n^3)$$

o - and ω -notation

■ Strict versions of O and Ω

$$3n^3 + 90n^2 - 5n + 6046 = O(n^3)$$

$$3n^3 + 90n^2 - 5n + 6046 \neq o(n^3)$$

$$3n^3 + 90n^2 - 5n + 6046 = o(n^{3.01})$$

$$3n^3 + 90n^2 - 5n + 6046 = \Omega(n^3)$$

$$3n^3 + 90n^2 - 5n + 6046 \neq \omega(n^3)$$

$$3n^3 + 90n^2 - 5n + 6046 = \omega(n^{2.99})$$

Θ -notation

■ Formally

$\Theta(g(n)) = \{f(n) : \text{there exist positive constants } c_1, c_2, \text{ and } n_0 \text{ such that } 0 \leq c_1g(n) \leq f(n) \leq c_2g(n) \text{ for all } n \geq n_0\} .$

■ Informally

- drop low order terms, ignore leading constants to form a **tight** (both **lower and upper**) bound

$$3n^3 + 90n^2 - 5n + 6046 = \Theta(n^3)$$

Algorithm design paradigms

- Divide-and-conquer
- Dynamic programming
- Greedy
- Branch-and-bound
- ...

Methods for running time complexity

■ Master Method

- Applies to limited types of algorithms

■ Substitution Method

- Difficult to make the guess that works
- Might not work (lead to induction that works)

■ Recursive Tree Method

- Difficult to get tight complexity

Example: Fibonacci numbers

- Calculate n^{th} Fibonacci number
 - $F_0=0, F_1=1, F_i=F_{i-1}+F_{i-2}$ for $i \geq 2$
- Divide-and-conquer solution
 - Running time?
 - How to improve?