

Sum on TI89: F3→sum(eq.i.lo,hi)

Complexity: $n! > 2^n > n^3 > n^2 > n \lg n > n > \sqrt{n} > \lg n > 1$

Notations:

- Θ bounds fcn to within factors (tight bound)
- O =upper, Ω =lower
- Any linear fcn is also $O(n^2)$
- Use O for guaranteed blanket statement
- Right side coarser than left (i.e. $2n^2 + \Theta(n) = \Theta(n^2)$)

Common fcns:

- Mod: $a \% n = a - n \lfloor a/n \rfloor$, $0 \leq a \% n < n$
- Polynomials: given $d \geq 0$, a poly in n of degree d is $p(n) = \sum_{i=0}^d a_i n^i$ where a_0, a_1, \dots, a_d are the coeffs. of the poly and $a_d \neq 0$
- Exponentials for all real x : $e^x = 1 + x + x^2/2! + x^3/3! + \dots = \sum_{i=0}^{\infty} \frac{x^i}{i!}$
 $\geq 1 + x$

Insertion sort(A) -- $\Theta(n^2)$

- For $i=2 \dots A.\text{len}$
 - $\text{key} = A[i]$
 - $J = i-1$
 - While $j > 0$ & $A[j] > \text{key}$
 - $A[i+1] = A[i]$
 - $i--$
 - $A[i+1] = \text{key}$
- Loop invariants: original elems of $A[1 \dots i-1]$, but now sorted
 - Initialization: is it true prior to 1st loop?
 - Maintenance: if true before 1st, still true before next?
 - Termination: after loop, invar. gives useful property that helps show if alg is correct

Binary search(sorted A, L(start@0), R(start@n-1)) -- $O(\lg n)$

- If $L > R$ return 1
- $m = (L+R)/2$
- If $A_m < T$, $\text{binsearch}(A, m+1, R)$
- If $A_m > T$, $\text{binsearch}(A, L, m-1)$
- Return m

Divide and conquer:

- If $n > c \rightarrow aT(n/b) + D(n) + C(n)$
- Conq+div+comb
- $D = \text{const}$, $C = n \rightarrow D(n) + C(n) = \Theta(n)$
- $a=2$, $b=2 \rightarrow 2T(n/2) + \Theta(n)$ if $n > 1$ (2 subprobs of $\frac{1}{2}$ size)
- $= 2T(n/2) + cn$ where $c = \text{time for } n=1$
- $\frac{2}{3}$ and $\frac{1}{3}$ subs: if $D+C$ linear $\rightarrow \text{recur} = T(\frac{2}{3}n) + T(\frac{1}{3}n) + \Theta(n)$
- Some have inconsistent sub sizes (ex: lin. search, $\text{sub} = n-1 \rightarrow T(n-1) + \Theta(n)$)
- **Merge sort -- $\Theta(n \lg n)$**
- Methods of solving recurrences:
 - Substitution: guess bound, subst. into eq./ineq. w/ $T(m < n)$, show that it works for $c > 0$, show that it holds for boundary conditions ($n \geq n_0$)
 - Recursion tree: used to find good guess for subst. Sum cost of each level, then sum per-lvl costs

- Master: $T(n) = aT(n/b) + f(n)$
 1. If $f(n) = O(n^{\log_b(a)-e})$ for $e > 0 \rightarrow T(n) = \Theta(n^{\log_b(a)})$
 2. If $f(n) = \Theta(n^{\log_b(a)}) \rightarrow T(n) = \Theta(n^{\log_b(a)} \lg n) = \Theta(f(n) \lg n)$
 3. If $f(n) = \Omega(n^{\log_b(a)+e})$ for $e > 0 \rightarrow T(n) = \Theta(f(n))$

Dynamic programming: when subprobs share subsubprobs

- When to use:
 - Optimal substructure: exhibited if an opt sol contains within it opt sols to subprobs
 - Overlapping subprobs: subprobs revisited multiple times
- Steps to develop:
 1. Characterize structure of an optimal solution
 2. Recursively define the value of opt sol
 3. Compute val of opt sol, typically bottom-up
 4. (Optional) Construct opt sol from computed information
- Top-down: write recursively in natural manner, but save result of each subprob
- Bottom-up: depends on natural subprob 'size.' Sort by size and solve smallest first
- 0-1 Knapsack: items are indivisible
 - **Brute force -- $O(2^n)$**
 - N items $\rightarrow 2^n$ combos
 - ltr through combos, find highest value
 - **DP -- $O(nW)$**
 - For $w=0 \dots W$
 - $B[0, w] = 0$
 - For $i=0 \dots n$
 - $B[i, 0] = 0$
 - For $w=0 \dots W$
 - If $w \leq w_i$
 - If $b_i + B[i-1, w-w_i] > B[i-1, w]$
 - $B[i, w] = b_i + B[i-1, w-w_i]$
 - Else $B[i, w] = B[i-1, w-w_i]$
 - Else $B[i, w] = B[i-1, w]$
 - Longest increasing subsequence:
 - $L[i]$ is len of LIS ending in A_i
 - Subs don't have to be consecutive
 - $L[n] = 1 + \max(L[j])$ for all j such that $A_j < A_n$
 - $\text{LIS} = \max(L[1], L[2] \dots L[n])$
 - **Recursive = $O(2^n)$**
 - **Bottom-up(DP) = $O(n^2)$**
 - Longest common subsequence:
 - Bases must appear in same order, but not necessarily consecutively
 - Brute force requires enumerating all subs of X and checking if subs of Y , keeping track of longest
 - **Since X has 2^n subs, exp time required ($O(2^{2^n})$)**
 - **DP -- $\Theta(mn)$**
 - $B[1 \dots m, 1 \dots n]$ to construct opt sol, $c[0 \dots m, 0 \dots n]$ to store length
 - For $i=1 \dots m, j=1 \dots n$
 - If $X[i] == Y[j] \dots \text{etc.}$

Greedy: always make *locally* optimal choice

- Elements:
 1. Determine opt substr
 2. Develop recursive sol
 3. Show that making greedy choice \rightarrow only 1 subprob left
 4. Prove it's always safe to make greedy choice
 5. Develop recursive alg that implements greedy strat
 6. Convert rec alg into iterative alg
- **Fractional Knapsack -- $O(n \lg n)$**
 - Keep taking item with highest value (benefit/weight ratio)
 - $\text{fKnap}(S, W)$
 - For i in S
 - $x_i = 0$
 - $v_i = b_i / w_i$ //value
 - $w = 0$ //current total weight
 - While $w < W$
 - Remove item i with highest v_i
 - $x_i = \min(w_i, W - w)$
 - $w = w + x_i$
- Scheduling:
 - Choose activity w/ earliest finish time and start time \geq last act finish
 - **recursively(s, f, k, n) -- $\Theta(n)$**
 - $m = k+1$
 - While $m \leq n$ & $s[m] < f[k]$
 - $m = m+1$
 - If $m \leq n$
 - Return $\{a_m\} \text{Urecursively}(s, f, m, n)$
 - Else return
 - **iteratively(s, f) -- $\Theta(n)$**
 - $n = s.\text{len}$
 - $A = \{a_i\}$
 - $k = 1$
 - For $m = 2 \dots n$
 - If $s[m] \geq f[k]$
 - $A = A \cup \{a_m\}$
 - $k = m$
 - Return A
- **coinchange(V, A) -- $\Theta(A)$**
 - For $i = n \dots 0$
 - While $A \geq V[i]$
 - $A = A - V[i]$
 - $C[i]++$
 - $\text{min} = \text{sum}(C)$
- **huffman(C) -- $O(n \lg n)$**
 - $n = |C|$
 - $Q = C$
 - For $i = 1 \dots n-1$
 - $z.\text{left} = x = \text{extract_min}(Q)$
 - $z.\text{right} = y = \text{extract_min}(Q)$
 - $z.\text{freq} = x.\text{freq} + y.\text{freq}$

- Insert(Q,z)
- Return extract_min(Q) //return root of tree

Graph Problems:

- Adjacency lists: good for *sparse* graphs, usually method of choice
- Adjacency matrix: only when graph is *dense* ($|E|$ is close to $|V|^2$) or need to tell fast if 2 verts are adj
- **BFS -- $O(V+E)$** (linear in size of adj-list G)
 - Produces breadth-first tree
 - Finds shortest path from s to each v
- **DFS -- $O(V+E)$**
 - Search may repeat from multiple sources
 - Produces depth-first forest (several df trees)
 - Records timestamps of vert discovery and completion of examining v's adj-list
 - Discovery and finish times have well-nested *parenthesis structure*
 - **Topological Sort -- $O(V+E)$**
 - Linear ordering of all verts of *directed acyclic graph* such that if G contains edge (u,v), u appears before v in the ordering
 - Call DFS(G) and insert each vert onto front of linked list
- MSTs: Least cost to connect all verts acyclically (both algs greedy)
 - **Kruskal's -- $O(E \lg V)$**
 - Set is a forest, edge added always lightest in the graph that connects two diff components
 - **Prim's -- $O(E \lg V)$, reduced to $O(E+V \lg V)$ using fib heaps if $|V| \ll |E|$**
 - Uses single tree, starts at arb root, adds lightest edge at each step
- Single-source shortest paths:
 - **Bellman-Ford -- $O(VE)$**
 - Weighted, directed graph
 - Allows negative edges, no negative cycles
 - Returns bool whether there is a neg cycle reachable from source, if there is, no solution exists, otherwise, produces paths and weights
 - Relaxation: testing if can improve path to v by going through u (source)
 - *By relaxing edges of weighted dag by topo sort, can compute sh paths from single src in $O(V+E)$*
 - **Dijkstra's -- $O((V+E) \lg V)$, which is $O(E \lg V)$ if all verts are reachable from source. $O(V^2)$ if $E=o(V^2/\lg V)$ (always $O(V^2)$, acc. to wiki)**
 - Weighted, non-neg directed graph
 - Always chooses closest (greedy, but still guarantees optimal)

Linear Programming:

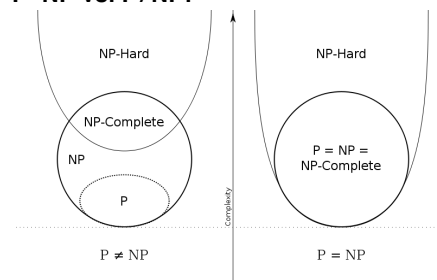
- Standard: all constraints \leq , obj fcn is maximization, all variables subject to non-neg
 - Change min to max by inverting obj fcn

- Split x w/ no non-neg into $x' - x''$ where $x', x'' \geq 0$
- Change = to ineq by splitting into \leq and \geq
- Change \geq to \leq by inverting signs
- **Slack:** all eqs. except non-neg constraints
 - Make slack variables = right side of ineq - left
 - All slack vars non-neg
 - Omit "maximize" and "subject to," and non-negs, rep obj fcn w/ $z = \dots$
- **Shortest path:** max d(dest), d(src)=0, for ea. edge $x \rightarrow y$, $d(y) \leq d(x) + \text{edge weight}$
- **Product Mix Problem:** How many of each type of tie to make per month, given material cost and max amt of material available?
 - Find profit per tie, use as coeff for obj fcn
 - Constraints: sum of yards/type * type \leq available for ea. material, min and max units of ea. type, non-negs
- **Transshipment:** Given m warehouses and n retailers with given supply and demand levels and costs from each W to R, how much product should be shipped along each route?
 - Add cost of each possible route for obj fcn
 - Constraints: Sum leaving $W_i \leq \text{supply}$, sum entering $R_j \geq \text{demand}$, non-negs for each route
- **Scheduling:** Given demand for buses at certain times, cover all buses with fewest drivers possible (ea. driver works 8 hr. shifts)
 - Min sum of # of drivers @ each 4 hr interval
 - Constraints: sum of two 4hr chunks for each 8hr shift (incl $x_{20} + x_4$) \geq # needed for later chunk

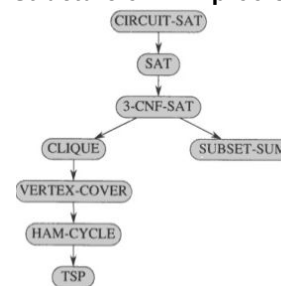
Complexity Classes:

- **P:** those problems solvable in poly time
- **NP:** problems verifiable in poly time (any problem in P is in NP)
- **NPH:** a poly time alg for the problem would imply a poly time alg for every prob in NP
- **NPC:** prob is NP and at least as hard as any problem in NP (both NPH and in NP)
- **Reductions:**
 - If $X \leq_p Y$: **Y is at least as hard as X**, if X is NPC and Y is in NP then Y is NPC, if Y in P then X in P
 - Given NPC X and Y and Z in P: $X \leq_p Y$, if $P \neq NP$, then no NPC can be solved in poly time
 - **NPC problems can be reduced to one another**
- **3-CNF satisfiability:** bool formula contains vars whose values are 0/1, bool connectives like \wedge , \vee , and \neg , and (). Bool formula is *satisfiable* if some assignment of 0s and 1s will cause it to evaluate to 1.
- **Bin Packing:** Can objects of diff vols be packed into k bins of vol V?
- **Circuit-SAT:** Given a bool circuit, is there a set of inputs that makes the circuit output True?
- **Clique:** Clique in an undirected G is subset of verts. Does a clique of size k exist in the graph?

- **Ham-Cycle/Path:** Does G have a ham cyc/path? (visits each vert exactly once)
- **Independent-Set:** Max size ind-set in G (set of verts in G, no two of which are adj)
- **K-Color:** Can verts of undir. G be colored w/ $\leq k$ colors, such that no vert matches any neighbors?
- **Knapsack:** Can a value of $\geq V$ be reached without exceeding W?
- **Long-Path:** Find simple path (no repeated verts) of max length in G. Has linear time solution for dags.
- **Subset-Sum:** Given a set or multiset of ints, is there a non-empty subset (consec.) whose sum is 0?
- **TSP:** Shortest Hamiltonian Cycle in G?
- **Vertex-Cover:** Does G have vertex cover of size $\leq k$? (set of verts such that each edge of G is incident to at least one vert of the set)
- **P=NP vs. P \neq NP:**



Structure of NPC proofs:



($X \rightarrow Y = X$ reduces to Y)