**Divide and Conquer:** Divide into disjoint subproblems, then combine

- Merge Sort: in  $O(n \log n)$
- Count inversion: by augmenting Merge Sort
- Closest Pair: by merging center with delta and 11 closest y points
- Karatsuba: By replacing  $x_1y_2 + x_2y_1$  with  $(x_1 + x_2)(y_1 + y_2) x_1y_1 x_2y_2$ ; evaluate polynomial at different points
- Strassen: Karatsuba for matrix multiplication

**Greedy:** Local optimal yields global optimal without memory; Prove optimality by contradiction or induction

- Interval Scheduling: Earliest finish time (replace non EFT by EFT)
- Interval Partitioning: Earliest start time (add one if not capable, argue optimal by depth is precisely the solution)
- Minimizing Lateness: Earliest deadline (argue removing inversion)
- Huffman (Lossless compression): Build prefix free tree by merging two smallest freqs (argue combining 2 smallest freqs remains optimal reversely)

**Dynamic Programming:** Greedy with memory; Optimal substructure and overlapping subproblems

Let  $\mathrm{OPT}(i)$  be the optimal solution for the first i items

Let S(i) denote solution for the first i items Bellman Equation:  $\mathrm{OPT}(i) = \mathrm{Base}$  Case; Recursive Case

Solution:  $S(i)={\rm emptyset}$  for Base Case; S(i-1) or augmenting depending on Bellman Equation

Top-down: When not all subproblems are needed

Bottom-up: When all subproblems are needed; Prevents recursive call overhead; free memory early

- Weighted Interval Scheduling: Sort by finish time;
- Knapsack: Any sort; 2D array with weight and items; O(nW)
- Single Source Shortest Path: 2D array with ending node and number of edges;  $O(n^3)$
- Chain Matrix Product: 2D array with starting and ending matrix;  $O(n^3)$
- Edit Distance: 2D array with position of matching; O(nm) time and space
- Travelling Salesman: 2D array with remaining node set and starting node;  $O(n^2 2^n)$  with

space  $O(n2^n)$ 

Network Flow: Max flow = Min cut; Augmenting path; Residual graph; Ford-Fulkerson Source: s; Sink: t; Non-negative capacities c; directed graph

- s-t flow is  $f: E \to \mathbb{R}_{\geq 0}; \ o \leq f(e) \leq c(e);$  sum of incoming flow equals outgoing flow,  $f^{in}(v) = f^{out}(v)$
- s-t cut (A,B) is:  $s\in A, t\in B, A$  and B partition vertices
- Ford-Fulkerson: While residual has path. Let bottlenceck(P) be the minimum capacity of edges in path P of residual graph, Augment flow f by sending bottleneck(P) flow along path P; O((m+n)C);
- Edmons-Karp: Ford-Fulkerson with BFS to find shortest path;  $O(nm^2)$

$$v(f) := f^{in}(t) = f^{out}(s)$$
  
 $v(f) = f^{out}(A) - f^{in}(A)$  for all  $A$  (prove by summing each a in A, cancel in and out within A)

Cap(A,B): Sum of capacities of edges from A to B;  $v(f) \leq Cap(A,B)$  for any st-cut (A,B) by above

- Max Flow Min Cut: v(f) = Cap(A,B) for some st-cut (A,B) (Prove by letting A be reachable nodes from s and B be remaining for final  $G_f$  graph of FF, then outgoing edges are saturated (equal to capacity), and entering edges have zero flow otherwise in A, so  $v(f) = f^{out}(A) = Cap(A,B)$ )

Integrality Theorem: If all capacities are integers, then there exists an integral max flow, same for variants.

For application of network flow, first show 1-1 correspondence between feasible solution and flow by double implication, then

- Bipartite Matching: For bipartite graph, connect s to left, t to right, all edges have capacity 1; Max flow is max matching; O(nm) (flow with value k corresopnds to a matching with cardinality k)
- Hall's Marriage Theorem: Bipartite graph G has perfect matching iff neighbor  $|N(S)| \geq |S|$  for each  $S \subseteq U$  (edges with s or t have capacity 1, otherwise infinity, then cut must isolate s or
- Edge-Disjiont Paths (Find max num of edge-disjiont paths):(paths are flows by f(e)=1 if edge e is in a path otherwise 0, then with capacities 1, exists unique flow; reversely

construct paths by extracting edges from flow);

- Menger's Theorem: The maximum number of edge-disjoint paths from s to t is equal to the minimum number of edges (resp. vertices) whose removal disconnects s and t
- Multiple sources and sinks: Use master source and sink to connect the sources and sinks (with capacities infinity)
- Circulation: Negative supply node v with value k sends d(v) = k more flow than it receives; positive demand node v with value k receives d(v) = k more flow than it sends; zero node is transshipment node; Connect supply nodes with s, demand nodes with t, then circulation exists iff max flow value equals the sum of supplies.
- Circulation with Lower Bounds: For lower bound k between u and v, add k to d(u) and
   k to d(v), subtract k from upper bound
- Survey Design: Connect s to each customer with bounds  $[c_i,c_i']$ , connect each customer to each survey with [0,1], connect each survey to t with bounds  $[p_j,p_j']$ , edge from s to t with  $[0,\infty]$  (so that all nodes d(v)=0)
- Image Segmentation: Find min cut to segment image into two parts

➤ Theorem: Let  $a \ge 1$  and b > 1 be constants, f(n) be a function, and T(n) be defined on nonnegative integers by the recurrence  $T(n) \le a \cdot T\left(\frac{n}{b}\right) + f(n)$ , where n/b can be  $\left\lceil \frac{n}{b} \right\rceil$ . Let  $d = \log_b a$ . Then:

$$\circ \text{ If } f(n) = O \left( n^{d - \epsilon} \right) \text{ for some constant } \epsilon > 0 \text{, then } T(n) = O \left( n^d \right).$$
 
$$\circ \text{ If } f(n) = O \left( n^d \log^k n \right) \text{ for some } k \geq 0 \text{, then } T(n) = O \left( n^d \log^{k+1} n \right).$$
 
$$\circ \text{ If } f(n) = O \left( n^{d + \epsilon} \right) \text{ for some constant } \epsilon > 0 \text{, then } T(n) = O \left( f(n) \right).$$

Residual Graph:

- Suppose the current flow is f
- Define the residual graph  $(G_f t)$  be the following
  - The vertices are the same
  - For each edge e = (u, v) in G,  $G_f$  has at most two edges
    - A forward edge e = (u, v) with capacity c(e) f(e)
      - How much additional flow can we send on e
    - A backward edge  $e^{rev} = (v, u)$  with capacity f(e)
      - How much we can reduce the flow on e
    - Only add edges of capacity > 0

