

I. Searching

- Binary search $\left\{ \begin{array}{l} \text{cond: array is sorted} \\ \text{running time: } O(\log n) \end{array} \right.$

code: $\text{start} = 0$
 $\text{end} = \text{arr.length} - 1$
 while ($\text{start} \leq \text{end}$)
 $\text{mid} = (\text{start} + \text{end}) / 2$
 if ($\text{target} < \text{arr}[\text{mid}]$)
 $\text{end} = \text{mid} - 1$
 else $\text{start} = \text{mid} + 1$

Key Idea: Reduce & Conquer (maintain invariant)

- Newton's method: $x_{i+1} = x_i - \frac{f(x_i)}{f'(x_i)}$
 - usage: find local min. (if $f'(x) = 0$) \rightarrow needs 2nd derivative
 ⊕: fast convergence, simple
 ⊖: slow in higher dimension, $O(d^2)$
- Gradient Descent: more iteration than Newton's but faster amp
 - find good enough δ s.t. $x_{i+1} = x_i - \delta \cdot f'(x_i)$

II. Sorting

Sorting	Worst case	Best case	In-place	stable
Selection	$O(n^2)$	$\Theta(n^2)$	✓	✗
Insertion	$O(n^2)$	$\Theta(n)$ (almost sorted)	✓	✓
Bubble	$O(n^2)$ (reverse sort)	$\Theta(n)$ (already sorted)	✓	✓
Merge	$O(n \log n)$	$\Theta(n \log n)$	$O(n)$	✓
Quick	$O(n^2)$ (identical elements)	$\Theta(n \log n)$	$O(\log n)$	✗
Radix	$O(n)$	$\Theta(n)$	$O(n+k)$	✓
Heap	$O(n \log n)$	$O(n \log n)$	possible value	✗

Partitioning

- Hoare: $\text{pivot} = 3$
 $4 \ 1 \ 5 \ 2 \ 3 \rightarrow 3 \ 1 \ 1 \ 5 \ 2 \ 4 \rightarrow 3 \ 1 \ 2 \ 5 \ 4 \rightarrow 1 \ 2 \ 3 \ 5 \ 4$
 NOT STABLE
 - Lomuto: $\text{pivot} = 3$
 $4 \ 1 \ 5 \ 2 \ 3 \rightarrow 1 \ 4 \ 5 \ 2 \ 3 \rightarrow 1 \ 2 \ 5 \ 4 \ 3 \rightarrow 1 \ 2 \ 3 \ 5 \ 4$
 i is first el > pivot
- Quick sort optimization: \rightarrow stop when < 1024 , do insertion sort (almost sorted)
 \rightarrow pick good pivots (except 2 others)

Order Statistics: pick kth largest element.

Quick select: use partition, go either left/right. $O(n)$.

Knuth shuffle

for $i = 2 \rightarrow n$ do
 $r = \text{rand}(1, i)$
 swap(i, r)

Sorting shuffle \rightarrow assign rand to each and sort based on the rand numbers generated.

III. Trees (Search trees)

- supports Insert, delete, search, successor, predecessor, contains
- 1) AVL Tree: max height $2 \log n$
 height-balanced (differ by 1)
 Rotation: left-left, left-right, right-right, right-left
 Traversal: preorder (node, left, right), inorder (left, node, right), postorder (left, right, node)
 construction: $O(n \log n)$, $O(n)$ if sorted $\rightarrow 2T(\frac{n}{2}) + O(1) = T(n)$

Successor

If right != null \rightarrow right.successor()
 else while (parent != null && child < parent.right) \rightarrow child = parent
 return parent

Deletion \rightarrow 0: just delete; 1: connect child of parent

2: update x w/ successor(x). \rightarrow $x = \text{successor}(x)$
 delete(x), x.left = x.left
 if (x.right != null) x.parent = x.parent

2) (a,b)-tree / B-tree (b,2b)-tree: More than 1 key

- root node: $2 \leq \text{child} \leq b$, internal node $a \leq \text{child} \leq b$
 - keys are in sorted order
 - All leaf nodes are in the same depth
- split: lifting median up to parent (insertion)
 merge: merge siblings if $\leq b/2$ together
 share: merge + split $[b/2, b]$ together

3) Tries \rightarrow for strings search: $O(L)$ \leftarrow max length of word
 \rightarrow each node store 1 character / EOW character

4) kd-Trees \rightarrow split based on x_1, x_2, \dots, x_k cyclically

Search: $O(\sqrt{n})$, construction: $O(n \log n)$
 can also search nearest neighbor $O(k n^{1/k})$

5) Augmented Trees

1) Order statistics: find kth largest el. \rightarrow EXTRA support select(kth largest rank (value))

Idea: store weight of subtree $O(\log n)$
 Interval trees: which of these interval overlap w/ a given interval?
 which interval contains x? search: always go left unless null or $\text{max} < \text{target}$

Idea: store max of subtree endpoint
 Range trees: give me all points in range $[x, y]$ $\rightarrow O(\log n + k)$
 Idea: store max of left subtree
 Idea2: add weight of subtree if also need count

d-dimension: Query: $O(\log^d n + k)$, build: $O(\log^d n)$, space: $O(n \log^d n)$

IV. Hash tables

- supports Insert, search, delete, contains $O(1)$ expected
- DO NOT SUPPORT min, max, successor, predecessor
- 1) chaining: Space: $O(M + n)$
 Insert: $O(1)$; delete: $O(1)$; search: $O(n)$ worst
 expected max cost of n insertions, $O(1 + \alpha)$ expected
 $\alpha = 1: \Theta(\log n / \log \log n)$
- 2) Open addressing: problems: clustering
 a) Linear probing: deletion: set tombstone
 b) double hashing: $f(k) \rightarrow i.f(k) \bmod m$
 Expected cost: $O(\frac{1}{1-\alpha}) \rightarrow 1 + \frac{\alpha}{m} + \frac{\alpha^2}{m^2} + \dots$
 ⊕ save space, rarely allocate memory, cache friendly
 ⊖ sensitive to load, to hash functions

PROBLEM: SPACE

Resize: double the table. \rightarrow after $n \geq \frac{M}{2}$ \rightarrow amortized $O(1)$
 half the table \rightarrow after $n \leq \frac{M}{4}$

Fingerprint HT & Bloom: do not store key \rightarrow only (0,1) vector \rightarrow lead to false positives

BIG keys are expensive
 false positives $< P \Leftrightarrow 1 - (1 - \frac{1}{m})^n \approx 1 - (\frac{1}{2})^n < P \Leftrightarrow \frac{n}{m} \leq \log(\frac{1}{1-P})$
 $p = 0.1, m \approx 10^n$; $p = 0.05, m \approx 20^n$

Bloom: 2 hash functions
 $(1 - (1 - \frac{1}{m})^{\frac{n}{2}})^2 \approx (1 - (\frac{1}{2})^{\frac{n}{2}})^2 \approx \frac{n}{m} \leq \log(\frac{1}{1-P})$
 $p = 0.1, m \approx 5^n$; $p = 0.05, m \approx 7^n$

	sorted arr	search	insert	delete
CHANNING	sorted arr	$\log n / \log n$	$n / n/2$	$n / n/2$
	unsorted	$n / n/2$	n / n	$n / n/2$
	LL	$n / 1$	$n / 1$	$n / 1$

Skippers → search, insert, delete: $O(\log n)$ w/ high probability
 → max level for n elements: $O(\log n)$ " " " "

Open addressing: search → hash(key, 0) delete → hash(key, 1)
 → hash(key, 2) CANNOT SEARCH/INSERT
 hash(key, 2) AIT FULL

PQ & Binary Heaps

Insert, extractMin, decreaseKey → $O(\log n)$
 → need to maintain structure
 Binary Heaps → complete binary tree (all leaves are to the left) (need to swap w/ left)
 → max height: $\lceil \log n \rceil$
 → can handle duplicates
 build heap in $O(n)$! → all leaves are heap itself.
 so $O(\frac{n}{2}) + O(\frac{n}{4}) + \dots = O(n)$

Heapsort: extract max → put at the back → safe because extract max empty last index of array.
 UNSTABLE, $O(n \log n)$ worst, in place

GRAPHS → adj. list: $O(V+E)$ space, good for sparse graphs
 → adj. matrix: $O(V^2)$ space, good for dense graphs
 Directed
 → only outgoing/ingress edges
 → not symmetric

• Traversal → BFS: $O(V+E)$ on adj. list → Queue
 → DFS: $O(V)$ on adj. matrix → stack.
 store visited nodes → CANNOT EXPLORE ALL PATHS!! exponential

• DAG/TopoSort = Post-order DFS: $O(V+E)$

Each node is only processed once
 → Algo 1: Post-order DFS (process u iff neighbor list have been processed)
 → Algo 2: Find u w/o incoming edge, add to front, process edges, (Kahn) remove u and edges adj to u .

Def: Strongly Connected Components: \exists path $u \rightarrow v, v \rightarrow u, u, v$ diff comp.

DAG iff \exists Topo ORDER ← NOT guaranteed UNIQUE tho guaranteed if no cycle is enough.

SHORTEST PATHS

input	Algo	No Algo work if G have cycle
whatever	BF, $O(V^2)$	\exists cycle
unweighted all same	BFS, $O(V+E)$	
Tree	BFS/DFS, $O(V+E)$	
>0 edges	Dijkstra $O(E \log V)$	
DAGs	Toposort + relax $O(V+E)$	

(1) Bellman Ford:

$V-1$ * (relax every edge)
 $+1$ * (relax every edge) → check for cycle
 STOP early IF $|E|$ relaxation do not change any weight ← can be used to check if an estimate is correct
 INVARIANT: After i th iteration of BF
 - we have consider every path \forall at most i edges
 - $\forall v, \text{distEst}[v] \leq$ weight of any path from source to v of at most i hops/edges.

(2) Dijkstra (NONNEGATIVE EDGE ONLY). Idea: Relax in correct order s.t. every edge only relaxation
 INVARIANT: all processed vertex estimates is correct.
 start w/ node → add shortest path in PQ to the "explored" set

Queue: BFS: Take v discovered least recently
 Stack: DFS: Most
 PQ: Dijkstra: Take v w/ closest dist. to source

BIG IDEA:
 - maintain set of "explored" vertices
 - add v by following edges explored → not explored

PQ DS	ins	decrKey	delMin
Array	1	1	\sqrt{V}
AVL	$\log V$	$\log V$	$\log V$
Binary heap	$\log V$	$\log V$	$\log V$
Fib heap	1	1	$\log V$

Dijkstra = $O(V * (\text{insert} + \text{delMin}) + E * \text{decrKey}) \rightarrow E \log V$ w/ AVL or heap

Repeat:
 - find unexplored v w/ smallest est
 - relax all outgoing edges
 - mark vertex finished

contains: HT < keys, idx in heap >
 NO CYCLE IN SP TREE

• SHORTEST PATH MODES

(1) Undirected: no \ominus edge → Dijkstra, if \ominus edge, BF also cannot
 (2) Longest PATH → no \ominus cycle: \ominus weight + SSSP.
 Problem: on DAGs → \ominus all edge → Toposort + relax.
 (1) weight cycle

• UFDS

1d array → store parents. obj → just turn into ints by open addressing
 size array.
 RF: $O(1)$ find, $O(n)$ union. $h = \lceil \log n \rceil$
 WQU: $O(\log n)$ find, $O(\log n)$ union.
 WUPC: $O(kn)$ find, $O(kn)$ union
 Ackermann function.
 skewed tree GUPC: $O(n)$ worst case
 height increases iff 2 trees of same height combined.

MINIMUM SPANNING TREE

\neq SP, use it for minimum / maximum
 (1) No cycle (2) Heaviest edge on cycle \notin MST (RED Prop)
 (3) Cut an MST → 2MST, (4) Min edge crossing a cut \in MST (BLUE Prop)
 → cut can have >1 edge connecting

• PRIM (blue-only strategy)

each added edge is lightest on some cut
 $O(V * \text{extractMin} + E * \text{decrKey}) = O(E \log V)$ on AVL/heap
 Sort + $O(E * \text{UF operation}) \sim O(E \log V)$

• KRUSKAL

→ use UFDS
 $O(E \log V)$
 Sort + $O(E * \text{UF operation}) \sim O(E \log V)$
 Boruvka → use UFDS
 → parallelizable. 1 boruvka step:
 → add all edge edges. $O(V+E)$ - search for min outgoing edge
 Total: $\log V$ Boruvka steps
 In the beginning, we start with V connected components
 Union: $O(V)$ - add to MST
 Contract/Merge connected comp.

• SPECIAL CASES

(1) Kruskal's variant $O(E \log V)$: sort in heavy time (bucket sort)
 (2) Prim's variant: $O(V+E)$
 extract min: $O(1)$ → just heap
 decrKey: Lazy Deletion
 insert: $O(1)$ → just need to store seen nodes in HT
 (1) DAG w/ one root: \forall node != root, add min incoming edge
 (2) MAX ST: \ominus all edge, run MST
 NOTE: reweighting edges doesn't matter in MST ($\pm k$)
 Approx algo: \forall pair, find SP
 sketch proof: DFS on opt
 - kill steeper nodes all along
 - and subset of its edges.
 → T is MST on G' .
 TSP MST: MST → DFS → ignore repeated nodes

• APSP

→ run SSSP V times
 $O(V(V+E))$ BFS on unweighted.
 $O(V^2 \log V)$ Dijkstra from every node
 Floyd Warshall
 subproblem: $A \rightarrow ? \rightarrow B$.
 $P_i = 1, \dots, i$
 $i, j = 1, 2, \dots, V-2$
 $O(V^3)$
 basecase: $S[V, w, \phi] = E[V, w]$
 relation: $S[V, w, P_{i+1}] = \min(S[V, w, P_i], S[V, i, P_i] + S[i, w, P_i])$

- class NeighborList extends ArrayList
- class Node { int key; NeighborList neighbors }
- class Graph { Node[] vertices }

DFS (recursive)

```
DFS-Visit (Node[] nodeList, boolean[] visited, int start) {
    for (Integer v : nodeList[start].neighbors) {
        if (!visited[v]) {
            visited[v] = true;
            DFS-Visit (nodeList, visited, v);
        }
    }
}
```

```
DFS (Node[] nodeList) {
    boolean visited = new boolean[nodeList.length];
    for (start = 0; start < nodeList.length; start++) {
        if (!visited[start]) {
            visited[start] = true;
            DFS-Visit (nodeList, visited, start);
        }
    }
}
```

BFS (recursive)

```
BFS (Node[] nodeList, int startId) {
    boolean[] visited = new boolean[nodeList.length];
    int[] parent = new int[nodeList.length];
    Arrays.fill(parent, -1);
    Collection<Integer> frontier = new Collection<Integer>();
    frontier.add(startId);
    while (!frontier.isEmpty()) {
        Collection<Integer> nextFrontier = new Collection<Integer>();
        for (Integer v : frontier) {
            for (Integer w : nodeList[v].neighbors) {
                if (!visited[w]) {
                    visited[w] = true;
                    nextFrontier.add(w);
                    parent[w] = v;
                }
            }
        }
        frontier = nextFrontier;
    }
}
```

BFS/DFS (iterative)

```
BFS (Node[] nodeList, int start) {
    Queue<Integer> q = new LinkedList();
    q.add(start);
    while (!q.isEmpty()) {
        int curr = q.poll(); (or pop())
        for (Integer v : nodeList[curr].neighbors) {
            q.add(v);
        }
    }
}
```

BF → for (i=0; i < V.length; i++)
 for (Edge e : edgelist)
 relax(e)
 relax (int u, int v) {
 if (dist[u] > dist[v] + w(u,v)) {
 dist[v] = dist[u] + w(u,v)
 parent[v] = u
 }
}

Dijkstra

```
public Dijkstra {
    Graph G;
    PriorityQueue pq;
    double[] distTo;
    searchPath (int start) {
        pq.insert (start, 0);
        distTo = new double[G.size()];
        Arrays.fill(distTo, Infy);
        distTo[start] = 0;
        while (!pq.isEmpty()) {
            int curr = pq.dequeue();
            for (Edge e : G[curr].neighbors) {
                relax(e);
            }
        }
    }
}
```

```
relax (Edge e) {
    int v = e.from();
    int w = e.to();
    double weight = e.weight();
    if (distTo[v] > distTo[w] + weight) {
        distTo[w] = distTo[v] + weight;
        parent[w] = v;
        pq.decreaseKey (w, distTo[w]);
    } else {
        pq.insert (w, distTo[w]);
    }
}
```

WQ

```
Union (int p, int q) {
    int parent p = find(p);
    int parent q = find(q);
    if (size[parent p] > size[parent q]) {
        parent[parent q] = parent p;
        size[parent p] += size[parent q];
    } else {
        parent[parent p] = parent q;
        size[parent q] += size[parent p];
    }
}
```

PC

```
find (p) {
    root = p;
    while (parent[root] != root) {
        parent[root] = parent[parent[root]];
    }
    return root;
}
OR
find (p) {
    if (parent[p] == p) return p;
    parent[p] = find (parent[p]);
    return parent[p];
}
```

Cycle Detection (Tarjan) → DFS O(V+E)

```
void dfs (int u) {
    isVisited[u] = true;
    isInStack[u] = true;
    for (int v : adjList[u]) {
        if (isVisited[v] & !isInStack[v]) {
            print ("Cycle Detected");
        } else if (isVisited[v]) {
            continue;
        }
        dfs(v);
    }
    isInStack[u] = false;
}
```

```
dfs (int v, int parent) {
    color[v] = 1;
    for (int w : adjList[v]) {
        if (color[w] == 1) cycle!
        else if (color[w] == 0) {
            dfs (w, v);
        }
    }
    color[v] = 2;
}
```

PRIM

```

• Priority Queue pq
  for (Node v : G.V()) {
    pq.add(v, Inf);
  }
  pq.deqKey(start, 0)
• HashSet <Node> seen
  seen.put(start)
• HashMap <Node, Node> parent
  parent.put(start, null)
while (!pq.isEmpty()) {
  int curr = pq.delMin(); seen.put(curr);
  for (Edge e : adjEdgeList(curr)) {
    Node w = e.otherNode(curr);
    if (!seen.get(w) && currEstimate[curr] > e.getWeight()) {
      pq.deqKey(w, e.getWeight());
      currEstimate[w] = e.getWeight();
      parent.put(w, curr);
    }
  }
}

```

FW $O(V^3)$

```

int[][] APSP(E) {
  int[][] S = new int[V.length][E.length];
  for (int v=0; v<V.length; v++) {
    for (int w=0; w<V.length; w++) {
      S[v][w] = E[v][w];
    }
  }
  for (int k=0; k<V.length; k++) {
    for (int v=0; v<V.length; v++) {
      for (int w=0; w<V.length; w++) {
        S[v][w] = min(S[v][w], S[v][k] + S[k][w]);
      }
    }
  }
}

```

DFS Topo

```

DFSrec(u, nodelist, visited)
  for (int v : G[u].neighbors) {
    if (!visited[v]) {
      visited[v] = true;
      DFS-Visit(nodelist, visited, v);
    }
    put v at the back of Array.
  }

```

Khan

```

for all v in V:
  indeg[v] ← 0
  parent[v] ← -1
for each edge (u,v) in G:
  indeg[v]++
for all v where indeg[v]=0:
  Q.add(v)
while !Q.isEmpty():
  int curr = Q.delMin()
  for all v in edgeList(curr):
    if indeg[v] > 0:
      indeg[v]--;
    if indeg[v] == 0:
      Q.add(v)
      parent[v] = curr

```

toposort in order

Kruskal

```

Edge[] sortedEdges = G.E().sort();
ArrayList<Edge> mstEdges = new ArrayList<Edge>();
UnionFind uf = new UnionFind(G.V());
for (int i=0; i<sortedEdges.length; i++) {
  Edge e = sortedEdges[i];
  Node v = e.one();
  Node w = e.two();
  if (!uf.find(v) == uf.find(w)) {
    mstEdges.add(e);
    uf.union(v, w);
  }
}

```

Minimax

	Preprocess	Extraspaces	Query(s,d): min d's $O(E \log V)$
DJ	q on all v $O(VE \log V)$	store all badness $O(V^2)$	lookup $O(1)$
MST	any MST also $O(E \log V)$	store MST $O(V)$	MST+DFS $O(E \log V)$
	-	-	$O(E \log k)$ Brank
Binser	G' for all k $O(kE)$	$O(kV)$ store connected info	$O(\lg k)$