

1. $\Theta(1)$
2. $\Theta(\log_2 n)$
3. $\Theta(n)$
4. $\Theta(n \log_2 n)$
5. $\Theta(n^2)$
6. $\Theta(n^2 \log_2 n)$
7. $\Theta(n^3)$
8. $\Theta(2^n)$
9. $\Theta(n!)$

Property of asymptotic:

If $f(n) = O(g(n))$, then there exists positive constants c_1, c_2, n_0 such that $0 \leq c_1 g(n) \leq f(n) \leq c_2 g(n)$, for all $n \geq n_0$

If $f(n) = O(g(n))$, then there exists positive constants c, n_0 such that $0 \leq f(n) \leq c g(n)$, for all $n \geq n_0$

If $f(n) = \Omega(g(n))$, then there exists positive constants c, n_0 such that $0 \leq c g(n) \leq f(n)$, for all $n \geq n_0$

If $f(n) = o(g(n))$, then there exists positive constants c, n_0 such that $0 \leq f(n) < c g(n)$, for all $n \geq n_0$

If $f(n) = \omega(g(n))$, then there exists positive constants c, n_0 such that $0 \leq c g(n) < f(n)$, for all $n \geq n_0$

Reflexivity

If $f(n)$ is given then

$f(n) = O(f(n))$

If $f(n) = n^3 \Rightarrow O(n^3)$

Symmetry:

$f(n) = \Theta(g(n))$ if and only if $g(n) = \Theta(f(n))$

If $f(n) = n^2$ and $g(n) = n^2$ then $f(n) = \Theta(n^2)$ and $g(n) = \Theta(n^2)$

Transitivity:

$f(n) = O(g(n))$ and $g(n) = O(h(n)) \Rightarrow f(n) = O(h(n))$

If $f(n) = n$, $g(n) = n^2$ and $h(n) = n^3 \Rightarrow n$ is $O(n^2)$ and n^2 is $O(n^3)$ then n is $O(n^3)$

Transpose Symmetry:

$f(n) = O(g(n))$ if and only if $g(n) = \Omega(f(n))$

If $f(n) = n$ and $g(n) = n^2$ then n is $O(n^2)$ and n^2 is $\Omega(n)$

Since these properties hold for asymptotic notations, analogies can be drawn between functions $f(n)$ and $g(n)$ and two real numbers a and b .

$g(n) = O(f(n))$ is similar to $a \leq b$

$g(n) = \Omega(f(n))$ is similar to $a \geq b$

$g(n) = \Theta(f(n))$ is similar to $a = b$

$g(n) = o(f(n))$ is similar to $a < b$

$g(n) = \omega(f(n))$ is similar to $a > b$

Observations:

$\max(f(n), g(n)) = \Theta(f(n) + g(n))$

$O(f(n)) + O(g(n)) = O(\max(f(n), g(n)))$

Graph Algorithms

Algorithm	Time Complexity		Space Complexity
	Average	Worst	Worst
Dijkstra's algorithm	$O(E \log V)$	$O(V^2)$	$O(V + E)$
A* search algorithm	$O(E)$	$O(b^d)$	$O(b^d)$
Prim's algorithm	$O(E \log V)$	$O(V^2)$	$O(V + E)$
Bellman-Ford algorithm	$O(E \cdot V)$	$O(E \cdot V)$	$O(V)$
Floyd-Warshall algorithm	$O(V^3)$	$O(V^3)$	$O(V^2)$
Topological sort	$O(V + E)$	$O(V + E)$	$O(V + E)$

Graph Data Structure Operations

Data Structure	Time Complexity					
	Storage	Add Vertex	Add Edge	Remove Vertex	Remove Edge	Query
Adjacency list	$O(V+E)$	$O(1)$	$O(1)$	$O(V + E)$	$O(E)$	$O(V)$
Incidence list	$O(V+E)$	$O(1)$	$O(1)$	$O(E)$	$O(1)$	$O(E)$
Adjacency matrix	$O(V^2)$	$O(V^2)$	$O(1)$	$O(V^2)$	$O(1)$	$O(1)$
Incidence matrix	$O(V \cdot E)$	$O(V \cdot E)$	$O(V \cdot E)$	$O(V \cdot E)$	$O(V \cdot E)$	$O(1)$

Array Sorting Algorithms

Algorithm	Time Complexity			Space Complexity
	Best	Average	Worst	Worst
Quicksort	$O(n \log(n))$	$O(n \log(n))$	$O(n^2)$	$O(\log(n))$
Mergesort	$O(n \log(n))$	$O(n \log(n))$	$O(n \log(n))$	$O(n)$
Timsort	$O(n)$	$O(n \log(n))$	$O(n \log(n))$	$O(n)$
Heapsort	$O(n \log(n))$	$O(n \log(n))$	$O(n \log(n))$	$O(1)$
Bubble Sort	$O(n)$	$O(n^2)$	$O(n^2)$	$O(1)$
Insertion Sort	$O(n)$	$O(n^2)$	$O(n^2)$	$O(1)$
Selection Sort	$O(n^2)$	$O(n^2)$	$O(n^2)$	$O(1)$
Tree Sort	$O(n \log(n))$	$O(n \log(n))$	$O(n^2)$	$O(n)$

Shell Sort	$O(n \log(n))$	$O(n \log(n)^2)$	$O(n \log(n)^2)$	$O(1)$
Bucket Sort	$O(n+k)$	$O(n+k)$	$O(n^2)$	$O(n)$
Radix Sort	$O(nk)$	$O(nk)$	$O(nk)$	$O(n+k)$
Counting Sort	$O(n+k)$	$O(n+k)$	$O(n+k)$	$O(k)$
Cubesort	$O(n)$	$O(n \log(n))$	$O(n \log(n))$	$O(n)$

各种常见算法框架以及时间复杂度

Bubble Sort:

Time Complexity

Best $O(n)$

Worst $O(n^2)$

Average $O(n^2)$

Space Complexity $O(1)$

Stability Yes

```
def bubblesort(nums):
    for i in range(len(nums)):
        ## For the second iteration, the reason that it use the len(ums) - i - 1
        ## is that for every iteration, the largest
        ## number is always going to be put at the end of the list.
        ## therefore, there is no need to re compare the last two.
        for j in range(len(nums) - i - 1):
            if nums[j] > nums[j + 1]:
                nums[j], nums[j + 1] = nums[j + 1], nums[j]
```

Insertion Sort:

Insertion Sort Complexity

Best $O(n)$

Worst $O(n^2)$

Average $O(n^2)$

Space Complexity $O(1)$

Stability Yes

```
def insertionSort(nums):
    ## suppose always the first one is sorted. Then do not need to iterate the first
    for i in range(1, len(nums)):
        key = nums[i]
        j = i - 1
        while j >= 0 and key < nums[j]:
            ## move this items to the next position. 往后移位, 给前面腾空间.
            nums[j + 1] = nums[j]
            ## 一直移位, 直到不用移动了
            j -= 1
        nums[j + 1] = key
```

Merge Sort:

Merge Sort Complexity

Best $O(n \log n)$

Worst $O(n \log n)$

Average $O(n \log n)$

Space Complexity $O(n)$

Stability Yes

```
def merge(arr, l, m, r):
    n1 = m - l + 1
    n2 = r - m
    # create temp arrays
    L = [0] * (n1)
    R = [0] * (n2)
    # alternative
    # L = [0 for i in range(n1)]
    # R = [0 for i in range(n2)]
    # Copy data to temp arrays L[] and R[]
    for i in range(0, n1):
        L[i] = arr[l + i]
    for j in range(0, n2):
        R[j] = arr[m + 1 + j]
    # Merge the temp arrays back into arr[l..r]
    i = 0 # Initial index of first subarray
    j = 0 # Initial index of second subarray
    k = l # Initial index of merged subarray
    while i < n1 and j < n2:
        if L[i] <= R[j]:
            arr[k] = L[i]
            i += 1
        else:
            arr[k] = R[j]
            j += 1
        k += 1
    # Copy the remaining elements of L[], if there
    # are any
    while i < n1:
        arr[k] = L[i]
        i += 1
    # Copy the remaining elements of R[], if there
    # are any
    while j < n2:
        arr[k] = R[j]
        j += 1
        k += 1
def mergeSort_2(arr, l, r):
    if l < r:
        # Same as (l+r)//2, but avoids overflow for
        # large l and h
        m = l+(r-l)//2
        # Sort first and second halves
        mergeSort(arr, l, m)
        mergeSort(arr, m+1, r)
    merge(arr, l, m, r)
```

Quick Sort

Quick Sort Complexity	
Best	$O(n \log n)$
Worst	$O(n^2)$
Average	$O(n \log n)$
Space Complexity	$O(\log n)$
Stability	No

```
def partition(nums, left, right):
    pivot = nums[right]
    pointer = left - 1
    for i in range(left, right):
        if nums[i] <= pivot:
            pointer += 1
            # remember, pointer is always to keep the last item that is smaller than pivot, therefore, once nums[i] is smaller
            # than pivot, pointer plus one then swap nums[i] with nums[pointer]
            nums[pointer], nums[i] = nums[i], nums[pointer]
    # this is the place that swap the pivot and the pointer + 1, pointer now is the last one that is smaller than pivot
    # pointer + 1 is the first bigger than pivot one, after this one, pivot will be in the right position
    nums[right], nums[pointer + 1] = nums[pointer + 1], nums[right]
    # after swapping, pointer + 1 is the pivot's current position
    return pointer + 1

def quicksort(nums, left, right):
    if left < right:
        # is to get the pivot's current position, use to divide the original nums into two by using partition position.
        parti = partition(nums, left, right)
        quicksort(nums, left, parti - 1)
        quicksort(nums, parti + 1, right)
```

Heap Sort

Heap Sort Complexity	
Best	$O(n \log n)$
Worst	$O(n \log n)$
Average	$O(n \log n)$
Space Complexity	$O(1)$
Stability	No

```
def heapSort(arr):
    n = len(arr)
    # Build max heap
    # n // 2 is the last root node among the all nodes.
    for i in range(n//2, -1, -1):
        heapify(arr, n, i)
    print(arr)

    for i in range(n-1, 0, -1):
        # since the tree has already been a max heap, the first one, arr[0] is always the biggest,
        # Swap it with the last arr[i], where i start from the last.
        arr[i], arr[0] = arr[0], arr[i]
        # Heapify root element, here, we use i, means we do not include the last items when we heapify, which means remove.
        heapify(arr, i, 0)
```

Binary search:

```
int binarySearch(int[] nums, int target) {
    int left = 0;
    int right = nums.length - 1; // 注意

    while(left <= right) {
        int mid = left + (right - left) / 2;
        if(nums[mid] == target)
            return mid;
        else if (nums[mid] < target)
            left = mid + 1; // 注意
        else if (nums[mid] > target)
            right = mid - 1; // 注意
    }
    return -1;
}
```

Graph:
Traverse graph:

```
// 记录所有路径
List<List<Integer>> res = new LinkedList<>();

public List<List<Integer>> allPathsSourceTarget(int[][] graph) {
    // 维护递归过程中经过的路径
    LinkedList<Integer> path = new LinkedList<>();
    traverse(graph, 0, path);
    return res;
}

/* 图的遍历框架 */
void traverse(int[][] graph, int s, LinkedList<Integer> path) {
    // 添加节点 s 到路径
    path.addLast(s);

    int n = graph.length;
    if (s == n - 1) {
        // 到达终点
        res.add(new LinkedList<>(path));
        // 可以在这里 return, 但要 removeLast 正确维护 path
        // path.removeLast();
        // return;
        // 不 return 也可以, 因为图中不包含环, 不会出现无限递归
    }

    // 递归每个相邻节点
    for (int v : graph[s]) {
        traverse(graph, v, path);
    }

    // 从路径移除节点 s
    path.removeLast();
}
```

```
// 判断输入的若干条边是否能构造出一棵树结构
boolean validTree(int n, int[][] edges) {
    // 初始化 0...n-1 共 n 个节点
    UF uf = new UF(n);
    // 遍历所有边, 将组成边的两个节点进行连接
    for (int[] edge : edges) {
        int u = edge[0];
        int v = edge[1];
        // 若两个节点已经在同一连通分量中, 会产生环
        if (uf.connected(u, v)) {
            return false;
        }
        // 这条边不会产生环, 可以是树的一部分
        uf.union(u, v);
    }
    // 要保证最后只形成了一棵树, 即只有一个连通分量
    return uf.count() == 1;
}

class UF {
    // 见上文代码实现
}
```

```
// 记录图是否符合二分图性质
private boolean ok = true;
// 记录图中节点的颜色, false 和 true 代表两种不同颜色
private boolean[] color;
// 记录图中节点是否被访问过
private boolean[] visited;

// 主函数, 输入邻接表, 判断是否是二分图
public boolean isBipartite(int[][] graph) {
    int n = graph.length;
    color = new boolean[n];
    visited = new boolean[n];
    // 因为图不一定是联通的, 可能存在多个子图
    // 所以要把每个节点都作为起点进行一次遍历
    // 如果发现任何一个子图不是二分图, 整幅图都不算二分图
    for (int v = 0; v < n; v++) {
        if (!visited[v]) {
            traverse(graph, v);
        }
    }
    return ok;
}

// DFS 遍历框架
private void traverse(int[][] graph, int v) {
    // 如果已经确定不是二分图了, 就不用浪费时间再递归遍历了
    if (!ok) return;

    visited[v] = true;
    for (int w : graph[v]) {
        if (!visited[w]) {
            // 相邻节点 w 没有被访问过
            // 那么应该给节点 w 涂上和节点 v 不同的颜色
            color[w] = !color[v];
            // 继续遍历 w
            traverse(graph, w);
        } else {
            // 相邻节点 w 已经被访问过
            // 根据 v 和 w 的颜色判断是否是二分图
            if (color[w] == color[v]) {
                // 若相同, 则此图不是二分图
                ok = false;
            }
        }
    }
}
```

```

int minimumCost(int n, int[][] connections) {
    // 城市编号为 1...n, 所以初始化大小为 n + 1
    UF uf = new UF(n + 1);
    // 对所有边按照权重从小到大排序
    Arrays.sort(connections, (a, b) -> (a[2] - b[2]));
    // 记录最小生成树的权重之和
    int mst = 0;
    for (int[] edge : connections) {
        int u = edge[0];
        int v = edge[1];
        int weight = edge[2];
        // 若这条边会产生环, 则不能加入 mst
        if (uf.connected(u, v)) {
            continue;
        }
        // 若这条边不会产生环, 则属于最小生成树
        mst += weight;
        uf.union(u, v);
    }
    // 保证所有节点都被连通
    // 按理说 uf.count() == 1 说明所有节点被连通
    // 但因为节点 0 没有被使用, 所以 0 会额外占用一个连通分量
    return uf.count() == 2 ? mst : -1;
}

class UF {
    // 见上文代码实现
}

```

BFS 框架:

```

// 计算从起点 start 到终点 target 的最近距离
int BFS(Node start, Node target) {
    Queue<Node> q; // 核心数据结构
    Set<Node> visited; // 避免走回头路

    q.offer(start); // 将起点加入队列
    visited.add(start);
    int step = 0; // 记录扩散的步数

    while (q not empty) {
        int sz = q.size();
        /* 将当前队列中的所有节点向四周扩散 */
        for (int i = 0; i < sz; i++) {
            Node cur = q.poll();
            /* 划重点: 这里判断是否到达终点 */
            if (cur is target)
                return step;
            /* 将 cur 的相邻节点加入队列 */
            for (Node x : cur.adj()) {
                if (x not in visited) {
                    q.offer(x);
                    visited.add(x);
                }
            }
        }
        /* 划重点: 更新步数在这里 */
        step++;
    }
}

```

Dijkstra:

```

class State {
    // 记录 node 节点的深度
    int depth;
    TreeNode node;

    State(TreeNode node, int depth) {
        this.depth = depth;
        this.node = node;
    }
}

```

```

// 返回节点 from 到节点 to 之间的边的权重
int weight(int from, int to);

```

```

// 输入节点 s 返回 s 的相邻节点
List<Integer> adj(int s);

```

```

// 输入一幅图和一个起点 start, 计算 start 到其他节点的最短距离
int[] dijkstra(int start, List<Integer>[] graph) {
    // 图中节点的个数
    int V = graph.length;
    // 记录最短路径的权重, 你可以理解为 dp table
    // 定义: distTo[i] 的值就是节点 start 到达节点 i 的最短路径权重
    int[] distTo = new int[V];
    // 求最小值, 所以 dp table 初始化为正无穷
    Arrays.fill(distTo, Integer.MAX_VALUE);
    // base case, start 到 start 的最短距离就是 0
    distTo[start] = 0;
}

```

```

// 优先级队列, distFromStart 较小的排在前面
Queue<State> pq = new PriorityQueue<>((a, b) -> {
    return a.distFromStart - b.distFromStart;
});

```

```

});

```

```

// 从起点 start 开始进行 BFS
pq.offer(new State(start, 0));

```

```

while (!pq.isEmpty()) {
    State curState = pq.poll();
    int curNodeID = curState.id;
    int curDistFromStart = curState.distFromStart;

    if (curDistFromStart > distTo[curNodeID]) {
        // 已经有一条更短的路径到达 curNode 节点了
        continue;
    }
    // 将 curNode 的相邻节点装入队列
    for (int nextNodeID : adj(curNodeID)) {
        // 看看从 curNode 达到 nextNode 的距离是否会更短
        int distToNextNode = distTo[curNodeID] + weight(curNodeID, nextNodeID);
        if (distTo[nextNodeID] > distToNextNode) {
            // 更新 dp table
            distTo[nextNodeID] = distToNextNode;
            // 将这个节点以及距离放入队列
            pq.offer(new State(nextNodeID, distToNextNode));
        }
    }
}
return distTo;
}

```

```

int networkDelayTime(int[][] times, int n, int k) {
    // 节点编号是从 1 开始的, 所以要一个大小为 n + 1 的邻接表
    List<int[]>[] graph = new LinkedList[n + 1];
    for (int i = 1; i <= n; i++) {
        graph[i] = new LinkedList<>();
    }
    // 构造图
    for (int[] edge : times) {
        int from = edge[0];
        int to = edge[1];
        int weight = edge[2];
        // from -> List<(to, weight)>
        // 邻接表存储图结构, 同时存储权重信息
        graph[from].add(new int[]{to, weight});
    }
    // 启动 dijkstra 算法计算以节点 k 为起点到其他节点的最短路径
    int[] distTo = dijkstra(k, graph);

    // 找到最长的那一条最短路径
    int res = 0;
    for (int i = 1; i < distTo.length; i++) {
        if (distTo[i] == Integer.MAX_VALUE) {
            // 有节点不可达, 返回 -1
            return -1;
        }
        res = Math.max(res, distTo[i]);
    }
    return res;
}

// 输入一个起点 start, 计算从 start 到其他节点的最短距离
int[] dijkstra(int start, List<int[]>[] graph) {}

```

Network flow:

Ford-Fulkerson algorithm in Python

from collections import defaultdict

class Graph:

```
def __init__(self, graph):
    self.graph = graph
    self.ROW = len(graph)
```

```
# Using BFS as a searching algorithm
def searching_algo_BFS(self, s, t, parent):
```

```
    visited = [False] * (self.ROW)
    queue = []
```

```
    queue.append(s)
    visited[s] = True
```

```
    while queue:
```

```
        u = queue.pop(0)
```

```
        for ind, val in enumerate(self.graph[u]):
            if visited[ind] == False and val > 0:
                queue.append(ind)
                visited[ind] = True
                parent[ind] = u
```

```
    return True if visited[t] else False
```

```
# Applying fordfulkerson algorithm
def ford_fulkerson(self, source, sink):
```

```
    parent = [-1] * (self.ROW)
    max_flow = 0
```

```
    while self.searching_algo_BFS(source, sink, parent):
```

```
        path_flow = float("Inf")
        s = sink
        while(s != source):
            path_flow = min(path_flow, self.graph[parent[s]][s])
            s = parent[s]
```

```
        # Adding the path flows
        max_flow += path_flow
```

```
        # Updating the residual values of edges
        v = sink
        while(v != source):
            u = parent[v]
            self.graph[u][v] -= path_flow
            self.graph[v][u] += path_flow
            v = parent[v]
```

```
    return max_flow
```

```
graph = [[0, 8, 0, 0, 3, 0],
          [0, 0, 9, 0, 0, 0],
          [0, 0, 0, 0, 7, 2],
          [0, 0, 0, 0, 0, 5],
          [0, 0, 7, 4, 0, 0],
          [0, 0, 0, 0, 0, 0]]
```

```
g = Graph(graph)
```

```
source = 0
```

```
sink = 5
```

```
print("Max Flow: %d " % g.ford_fulkerson(source, sink))
```


Network flow,