Sorting

Algorithm	In place	Stable	Best	Worst	Space	Remarks
Selection Sort	√		n^2	n^2	1	n exchanges; always pick next
Insertion Sort	√	√	n	n^2	1	for small/partially sorted arrays
Mergesort		√	$n \log n$	$n \log n$	N	Divide-and-conquer
Quicksort	V		$n \log n$	n^2	$\log N$	Shuffle first; fastest in practice
Heapsort	√		n^{\dagger}	$n \log n$	1	$\dagger n \log n$ if all keys distinct
LSD Radix		√	WN + WR	WN + WR	N+R	N: Number of keys. R: Size of
MSD Radix		√	N + R	WN + WR	N + WR	alphabet. W : Width of longest key

Symbol Tables

Data Structure	Worst Case			Average Case			
	Search	Insert	Delete	Search	Insert	Delete	Remarks
Binary Search Tree (Unbalanced)	n	n	n	$\log n$	$\log n$	\sqrt{n}	
LL Red-Black Tree	$\log n$	$\log n$	$\log n$	$\log n$	$\log n$	$\log n$	
Hash Table	n	n	n	1 [†]	1 [†]	1 [†]	† uniform hashing

Graph Processing

Algorithm	Useful For	Time	Space	Remarks
DFS	Path; Cycle; Topological sort	E + V	V	
BFS	Shortest path (fewest edges)	E + V	V	
Kruskal	Minimum spanning tree	$E \log E$	E + V	
Prim	Minimum spanning tree	$E \log V$	V	
Dijkstra	Shortest paths (nonnegative weights)	$E \log V$	V	
Topological Sort	Shortest paths (no cycles)	V + E	V	

Algorithm	Union	Find	Algorithm	Union	Find
Quick-Find	N	1	Weighted Quick-Union	$\log N$	$\log N$
Quick-Union	tree height	tree height	Weighted Quick-Union with Path Compression	amortized clo	se to 1

Quick-Find: \mathbf{p} and \mathbf{q} are connected iff id[p] = id[q]

Quick-Union: Each entry in id[] is the name of another element, i.e. a link

Runtime Analysis

```
\begin{array}{ll} 1+2+4+8+\ldots+N\sim N & 1+1/2+1/3+\ldots+1/N\sim \ln N \\ 1+2+3+4+\ldots+N\sim N^2 & \text{Alternatively, replace sum with an integral!} \end{array}
```

Sorting

```
public class Selection { // Runtime is insensitive to input; Data movement is minimal
   public static void sort(Comparable[] a) {
      int N = a.length;
                                        // array length
      for (int i = 0; i < N; I++) { // Exchange a[i] with smallest entry in a[i+1...N)
                                        // index of minimal entry.
         int min = i;
         for (int j = i+1; j < N; j++)

    Find the smallest item in the array and

             if (less(a[j], a[min])) min = j;
                                                           exchange it with the first entry
         exch(a, i, min);

    Find the next smallest item and

                                                           exchange it with the second entry
   }
                                                           Continue until the entire array is sorted
}
```

```
public class Merge {
      private static Comparable[] aux;
                                                // auxiliary array for merges
      public static void sort(Comparable[] a) {
            aux = new Comparable[a.length]; // Allocate space just once.
            sort(a, 0, a.length - 1);
      private static void sort(Comparable[] a, int lo, int hi) { // Sort a[lo..hi].
            if (hi ≤ lo) return;
            int mid = lo + (hi - lo)/2;
            sort(a, lo, mid);  // Sort left half.
sort(a, mid+1, hi);  // Sort right half.
            merge(a, lo, mid, hi); // Merge results
      } // BottomUp mergesort is good for data organized in linked list, no recursion
} // Use insertion sort for small subarrays; Eliminate the auxiliary array
public static void merge(Comparable[] a, int lo, int mid, int hi) {
      int i = lo, j = mid+1;
      for (int k = lo; k \le hi; k++) // Copy a[lo..hi] to aux[lo..hi].
            aux[k] = a[k];
      for (int k = lo; k \le hi; k++) { // Merge back to a[lo..hi].
            else if (j > hi )
                    (i > mid)
                                           a[k] = aux[j++]; // Left half exhausted
                                           a[k] = aux[i++]; // Right half exhausted
            else if (less(aux[j], aux[i])) a[k] = aux[j++]; // Right key less than left
                                           a[k] = aux[I++];
            else
      }
```

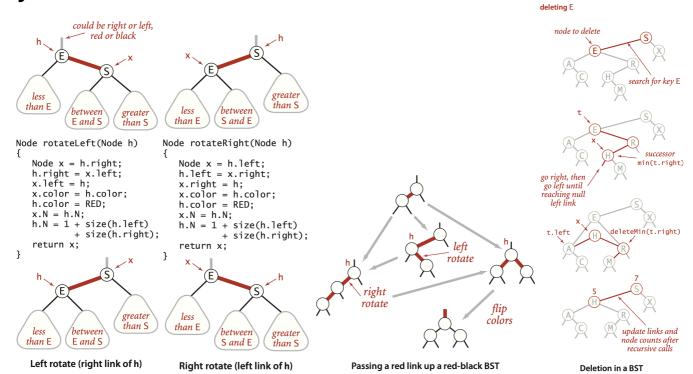
```
public class Quick {
      public static void sort(Comparable[] a) {
                                           // Eliminate dependence on input.
            StdRandom.shuffle(a);
            sort(a, 0, a.length - 1);
      private static void sort(Comparable[] a, int lo, int hi) {
            if (hi ≤ lo) return;
            int j = partition(a, lo, hi); // Partition (see page 291).
                                           // Sort left part a[lo .. j-1].
            sort(a, lo, j-1);
            sort(a, j+1, hi);
                                            // Sort right part a[j+1 .. hi].
      }
private static int partition(Comparable[] a, int lo, int hi) {
      int i = lo, j = hi+1;
                                        // left and right scan indices
      Comparable v = a[lo];
                                        // partitioning item
      while (true) { // Scan right, scan left, check for scan complete, and exchange.
            while (less(a[+i], v)) if (i = hi) break;
            while (less(v, a[--j])) if (j = lo) break;
            if (i \ge j) break;
            exch(a, i, j);
                                 Quicksort (Dijkstra) partitioning: Repeat until i and j pointers cross
      }
      exch(a, lo, j);
                                 • Scan i from left to right so long as a[i] < a[lo]
      return j;
                                    Scan j from left to left so long as a[j] > a[lo]

    Exchange a[i] with a[j]

public class Quick3way {
      private static void sort(Comparable[] a, int lo, int hi) {
            if (hi \leq lo) return;
            int lt = lo, i = lo+1, gt = hi;
            Comparable v = a[lo];
                                                                                    >V
                                                            <V
            while (i \leq gt) {
                  int cmp = a[i].compareTo(v);
                                                                  1t
                                                                                gt
                           (cmp < 0) exch(a, lt++, i++);
                  else if (cmp > 0) exch(a, i, gt--);
                                     i++;
            } // Now a[lo..lt-1] < v = a[lt..gt] < a[gt+1..hi].</pre>
            sort(a, lo, lt - 1);
            sort(a, gt + 1, hi);
} // Good for many duplicate keys; bad performance if keys are unique
```

Quicksort better for primitive types (unstable doesn't matter) whereas mergesort better for objects (stability)

Symbol Tables



Hibbard Deletion

- Save a link to the node to be deleted in t
- Set x to point to its successor min(t.right)
- Set the right link of **x** to deleteMin(**t**.right), the link to the BST containing all the keys that are larger than **x**.key after the deletion
- Set the left link of x to t.left

```
public class SeparateChainingHashST<Key, Value> {
    private int N, M; // number of key-value pairs, hash table size
    private SequentialSearchST<Key, Value>[] st; // array of ST objects
    public SeparateChainingHashST(int M) { // Create M linked lists.
        this.M = M;
        st = (SequentialSearchST<Key, Value>[]) new SequentialSearchST[M];
        for (int i = 0; i < M; i++)
            st[i] = new SequentialSearchST();
    }
    private int hash(Key key) { return (key.hashCode() & 0×7fffffff) % M; }
    public Value get(Key key) { return (Value) st[hash(key)].get(key); }
    public void put(Key key, Value val) { st[hash(key)].put(key, val); }
}</pre>
```

hashCode() must be consistent with equals → if a.equals(b), a.hashCode() must equal b.hashCode() → Do not override equals() without overriding hashcode()

```
public interface Iterable<Item> {
    Iterator<Item> iterator();
}
```

```
public interface Comparator<Key> {
    int compare(Key v, Key w)
}
```

Priority Queue

Insert = Add new key at the end of the array; size++; swim up through the heap
Remove max = Pop the largest key (index 0) and put item from end of heap at the top; size--; sink

```
private void sink(int k) {
   while (2*k \le N) {
      int j = 2*k;
      if (j < N & less(j, j+1)) j++;
      if (!less(k, j)) break;
      exch(k, j);
      k = j;
   }</pre>
```

```
}
private void swim(int k) {
   while (k > 1 & less(k/2, k)) {
      exch(k/2, k);
      k = k/2;
   }
}
```

Graphs

Kruskal Algorithm: $E \log E$

Consider edges in ascending order of weight

 Add next edge to tree T unless doing so would create a cycle

Operation	Frequency	Time Per Op	
Build PQ	1	E	
Delete Min	E	$\log E$	
Union	V	$\log^{\star} V^{\dagger}$	
Connected	E	$\log^{\star} V^{\dagger}$	

[†] amortized of WQU with path compression; If edges are already sorted, $E \log^{\star} V$ time

Dijkstra's Algorithm: $E \log V$ (assuming E > V)

Operation	Frequency	Time Per Op
PQ add	V	$\log V$
PQ removeSmallest	V	$\log V$
PQ changePriority	E	$\log V$

Prim's Algorithm: $E \log V$

- Start with some vertex and greedily grow tree T
- Add to T the min weight edge with exactly one endpoint in T
- Repeat until V-1 edges

Operation	Frequency	Time Per Op
Build PQ	1	V
Insert	V	$\log V$
Delete Min	V	$\log V$
Δ Priority	E	$\log V$
Assuming E	> V	

Stacks = Last-in-First-out Queue = First-in-First-out

Underlying Data Structure	Space	Add Edge	Check whether w is adjacent to v	Iterate through vertices adjacent to v
List of Edges	E	1	1	1
Adjacency Matrix	V^2	1	1	V
Adjacency Lists	E + V	1	degree(V)	degree(V)
Adjacency Sets	E + V	$\log V$	$\log V$	$\log V + degree(V)$

```
public class PrimMST {
      private Edge[] edgeTo;
                                      // shortest edge from tree vertex
      private double[] distTo;
                                      // distTo[w] = edgeTo[w].weight()
      private boolean[] marked;  // true if v on tree
      private IndexMinPQ<Double> pq; // eligible crossing edges
      public PrimMST(EdgeWeightedGraph G) {
            edgeTo = new Edge[G.V()];
            distTo = new double[G.V()];
            marked = new boolean[G.V()];
            for (int v = 0; v < G.V(); v++) distTo[v] = Double.POSITIVE_INFINITY;</pre>
            pg = new IndexMinPQ<Double>(G.V());
            distTo[0] = 0.0;
            pq.insert(0, 0.0);
                                           // Initialize pq with 0, weight 0.
            while (!pq.isEmpty())
                  visit(G, pq.delMin()); // Add closest vertex to tree.
      }
      private void visit(EdgeWeightedGraph G, int v) { // Add v to tree; update
            marked[v] = true;
            for (Edge e : G.adj(v)) {
                  int w = e.other(v);
                  if (marked[w]) continue;
                  if (e.weight() < distTo[w]) { // Edge e is new best connection</pre>
                         edgeTo[w] = e;
                         distTo[w] = e.weight();
                         if (pq.contains(w)) pq.change(w, distTo[w]);
                                             pq.insert(w, distTo[w]);
                         else
                  }
            }

    Start with vertex of and greedily grow tree T

                                                • Add to T the min weight edge with exactly one
      public Iterable<Edge> edges()
      public double weight()
                                                   endpoint in T
}
                                                • Repeat until V-1 edges
```

```
choose the edge of lightest weight in the graph
public class KruskalMST {
                                                   add it to the MST if adding that edge does not
      private Queue<Edge> mst;
                                                   create a cycle
      public KruskalMST(EdgeWeightedGraph G) {
            mst = new Queue<Edge>();
            MinPQ<Edge> pq = new MinPQ<Edge>(G.edges());
            UF uf = new UF(G.V());
            while (!pq.isEmpty() & mst.size() < G.V()-1) {
                                                       // Get min weight edge on pq
                  Edge e = pq.delMin();
                  int v = e.either(), w = e.other(v); // and its vertices.
                  if (uf.connected(v, w)) continue; // Ignore ineligible edges.
                  uf.union(v, w);
                                                      // Merge components.
                  mst.enqueue(e);
                                                       // Add edge to mst.
            }
      public Iterable<Edge> edges() { return mst; }
}
```

```
public class DijkstraSP {
      private DirectedEdge[] edgeTo;
      private double[] distTo;
      private IndexMinPQ<Double> pq;
      public DijkstraSP(EdgeWeightedDigraph G, int s) {
            edgeTo = new DirectedEdge[G.V()];
            distTo = new double[G.V()];
            pq = new IndexMinPQ<Double>(G.V());
            for (int v = 0; v < G.V(); v++)
                  distTo[v] = Double.POSITIVE_INFINITY;
            distTo[s] = 0.0;
            pq.insert(s, 0.0);
            while (!pq.isEmpty())
                   relax(G, pq.delMin()) // Always take the vertex that is closest
      private void relax(EdgeWeightedDigraph G, int v) {
            for (DirectedEdge e : G.adj(v)) {
                   int w = e.to();
                   if (distTo[w] > distTo[v] + e.weight()) { // Update shortest distance
                         distTo[w] = distTo[v] + e.weight();
                         edgeTo[w] = e;
                         if (pq.contains(w)) pq.change(w, distTo[w]);
                                              pq.insert(w, distTo[w]);
                   }
                                                 Start with distTo and edgeTo, and consider
            }
                                                 vertices in increasing distance from s
      }

    Always pick the next shortest path

}
                                                 For every adjacent edge, update the minPQ
```

```
bfs(graphNode s) {
   queue = new Queue! ◇()
   mark s as visited;
   queue.add(s);
   while (!queue.isEmpty()):
    v = queue.dequeue();
    for each unmarked neighbor of v:
        edgeTo[neighbor] = v;
        marked[neighbor] = true;
        queue.add(neighbor); }
```

```
hoare_partition(arr[], lo, hi)
   pivot = arr[lo]
   i = lo - 1  // Initialize left index
   j = hi + 1  // Initialize right index
   // Find a value in left side greater
   // than pivot
   while (arr[I] < pivot)
        i = i + 1
   // Find a value in right side smaller
   // than pivot
   while (arr[j] > pivot);
        j--;
   if i ≥ j then
        return j
   swap arr[i] with arr[j]
```

Strings

```
String[] arr1 = new String[5];
int[] arr2 = new int[] {3, 10, 7};
char[] arr3 = {'a', 'e', 'i', 'o', 'u'};
```

```
public class LSD {
      public static void sort(String[] a, int W) {
            int N = a.length;
            int R = 256;
            String[] aux = new String[N];
            for (int d = W-1; d \ge 0; d--) {
                  int[] count = new int[R+1];
                  for (int i = 0; i < N; i++)
                                                       // Compute frequency counts.
                        count[a[i].charAt(d) + 1]++;
                  for (int r = 0; r < R; r ++)
                                                       // Transform counts to indices.
                        count[r+1] += count[r];
                  for (int i = 0; i < N; i++)
                                                       // Distribute the data
                        aux[count[a[i].charAt(d)]++] = a[i];
                  for (int i = 0; i < N; i++)
                                                       // Copy back
                        a[i] = aux[i];
            }
      }
}
```

MSD: Use recursion to sort sub-arrays of the same prefix

- Performance relies on small subarrays that have the same prefix
- Need to switch to insertion sort for small subarrays
- MSD runtime varies from sublinear (average) to linear (worst case where all keys are equal)

When considering a number of LSD / MSD Radix sort, Bitstring is equal to $\log(N)$ where N is the largest number

Trie = Nodes with links; each node represents a letter

Search hit takes time proportional to the length of the search key

Search miss involves examining only a few characters

Not suitable for large numbers of long keys taken from large alphabets (otherwise takes excessive space)