

# TCR

git diff solution (Jens Heuseveldt, Ludo Pulles, Pim Spelier)

## CONTENTS

- 0.1. De winnende aanpak
- 0.2. Wrong Answer
- 0.3. Detecting overflow
- 0.4. Covering problems
- 0.5. Game theory
- 1. Mathematics
- 2. Datastructures
  - 2.1. Standard segment tree  $\mathcal{O}(\log n)$
  - 2.2. Binary Indexed Tree  $\mathcal{O}(\log n)$
  - 2.3. Disjoint-Set / Union-Find  $\mathcal{O}(\alpha(n))$
- 3. Graph Algorithms
  - 3.1. Maximum matching  $\mathcal{O}(nm)$
  - 3.2. Strongly Connected Components  $\mathcal{O}(V + E)$
  - 3.3. Cycle Detection  $\mathcal{O}(V + E)$
  - 3.4. Shortest path
  - 3.5. Max-flow min-cut
  - 3.6. Min-cost max-flow
  - 3.7. Minimal Spanning Tree
- 4. String algorithms
  - 4.1. Trie
  - 4.2. Z-algorithm  $\mathcal{O}(n)$
  - 4.3. Suffix array  $\mathcal{O}(n \log^2 n)$
  - 4.4. Longest Common Subsequence  $\mathcal{O}(n^2)$
  - 4.5. Levenshtein Distance  $\mathcal{O}(n^2)$
  - 4.6. Knuth-Morris-Pratt algorithm  $\mathcal{O}(N + M)$
  - 4.7. Aho-Corasick Algorithm  $\mathcal{O}(N + \sum_{i=1}^m |S_i|)$
- 5. Geometry
  - 5.1. Convex Hull  $\mathcal{O}(n \log n)$
  - 5.2. Rotating Calipers  $\mathcal{O}(n)$
  - 5.3. Closest points  $\mathcal{O}(n \log n)$
- 6. Miscellaneous
  - 6.1. Binary search  $\mathcal{O}(\log(hi - lo))$
  - 6.2. Fast Fourier Transform  $\mathcal{O}(n \log n)$
  - 6.3. Minimum Assignment (Hungarian Algorithm)  $\mathcal{O}(n^3)$
  - 6.4. Partial linear equation solver  $\mathcal{O}(N^3)$
- 7. Useful Information
- Misc
  - 8.1. Debugging Tips
  - 8.2. Solution Ideas
- 9. Formulas
  - 9.1. Physics
  - 9.2. Markov Chains
  - 9.3. Burnside's Lemma
  - 9.4. Bézout's identity
  - 9.5. Misc
- Practice Contest Checklist

At the start of a contest, type this in a terminal:

```
1 | printf "set nu sw=4 ts=4 sts=4 noet ai hls shellcmdflag=-ic\nsy on" > .vimrc
2 | printf "\nalias gsubmit='g++ -Wall -Wshadow -std=c++11'" >> .bashrc
3 | printf "\nalias gll='gsubmit -DLOCAL -g'" >> .bashrc
4 | . .bashrc
5 | mkdir contest; cd contest

template.cpp
1 | #include<bits/stdc++.h>
2 | using namespace std;
3
4 | // Order statistics tree (if supported by judge!):
5 | #include <ext/pb_ds/assoc_container.hpp>
6 | #include <ext/pb_ds/tree_policy.hpp>
7 | using namespace __gnu_pbds;
8
9 | template<class TK, class TM>
10 | using order_tree = tree<TK, TM, less<TK>, rb_tree_tag,
11 |     tree_order_statistics_node_update>;
12 | // iterator find_by_order(int r) (zero based)
13 | // int order_of_key(TK v)
14 | template<class TV> using order_set = order_tree<TV,
15 |     null_type>;
16
17 | #define x first
18 | #define y second
19 | #define pb push_back
20 | #define eb emplace_back
21 | #define rep(i,a,b) for(auto i=(a);i!=(b); ++i)
22 | #define all(v) (v).begin(), (v).end()
23 | #define rs resize
24
25 | typedef long long ll;
26 | typedef pair<int, int> pii;
27 | typedef vector<int> vi;
28 | typedef vector<vi> vvi;
29 | template<class T> using min_queue = priority_queue<T,
30 |     vector<T>, greater<T>>;
31
32 | const int INF = 2147483647; // (1 << 30) - 1 + (1 << 30)
33 | const ll LLINF = (1LL << 62) - 1 + (1LL << 62); // =
34 |     9.223.372.036.854.775.807
35 | const double PI = acos(-1.0);
36
37 | #ifdef LOCAL
38 | #define DBG(x) cerr << __LINE__ << ": " << #x << " = " << (x)
39 |     << endl
40 | #else
41 | #define DBG(x)
42 | #define DBG(x)
43 | const bool LOCAL = false;
44 | #endif
45
46 | void Log() { if(LOCAL) cerr << "\n\n"; }
47 | template<class T, class... S>
48 | void Log(T t, S... s) { if(LOCAL) cerr << t << "\t",
49 |     Log(s...); }
50 | }
```

```
// lambda-expression: [] (args) -> retType { body }
int main() {
    ios_base::sync_with_stdio(false); // fast IO
    cin.tie(NULL); // fast IO
    cerr << boolalpha; // print true/false
    (cout << fixed).precision(10); // adjust precision

    return 0;
}
```

Prime numbers:  $982451653$ ,  $81253449$ ,  $10^3 + \{-9, -3, 9, 13\}$ ,  $10^6 + \{-17, 3, 33\}$ ,  $10^9 + \{7, 9, 21, 33, 87\}$

## 0.1. De winnende aanpak.

- Goed slapen & een vroeg ritme hebben
- Genoeg drinken & eten voor en tijdens de wedstrijd
- Een lijst van alle problemen met info waar het over gaat, en wie het goed kan oplossen
- Ludo moet **ALLE** opgaves goed lezen
- Test de kleine voorbeeldgevallen
- Houd na 2 uur een pauze en overleg waar iedereen mee bezig is
- Maak zelf wat test-cases
- Typ de dingen uit de TCR, die je zeker nodig hebt, alvast in
- Als iemand niks te doen heeft, kan hij nodige dingen uit de TCR typen.
- We moeten ook een voorbeeld test-case voor TCR algoritmes hebben om te testen of het goed overgetypt is
- Bij geometrie moeten we om kunnen gaan met meerdere input manieren (voor bv. lijnen)
- Gebruik veel long long's

## 0.2. Wrong Answer.

- (1) Print de oplossing om te debuggen! Kijk ook naar andere (mogelijk makkelijkere) problemen.
- (2) Bedenk zelf test-cases met **randgevallen!**
- (3) Controleer op **overflow** (gebruik **OVERAL** long long, long double).
- (4) *Kijk naar overflows in tussenantwoorden bij modulo.*
- (4) Controleer de **precisie**.
- (5) Controleer op **typo's**.
- (6) Loop de voorbeeldinput accuraat langs.
- (7) Controller op off-by-one-errors (in indices of lus-grenzen)?

0.3. **Detecting overflow.** These are GNU builtins, detect both over- and underflow. Returns a boolean upon failure, otherwise the result is present in ref. Follow the template:

```
1 | bool isOverflown = __builtin_[add|mul|sub]_overflow(a, b, &res);
```

## 0.4. Covering problems.

*Minimum edge cover  $\iff$  Maximum independent set*

**Matching:** A set of edges without common vertices (*Maximum is the largest such set, maximal is a set which you cannot add more edges to without breaking the property*).

**Minimum Vertex Cover:** A set vertices (cover) such that each edge in the graph is incident to at least one vertex of the set.

**Minimum Edge Cover:** A set of edges (cover) such that every vertex is incident to at least one edge of the set.

**Maximum Independent Set:** A set of vertices in a graph such that no two of them are adjacent.

**König's theorem:** In any bipartite graph, the number of edges in a maximum matching equals the number of vertices in a minimum vertex cover

```
return r;
}
```

```
// returns x, y such that ax + by = gcd(a, b)
```

```
ll egcd(ll a, ll b, ll &x, ll &y) {
    ll xx = y = 0, yy = x = 1;
    while (b) {
```

```
x -= a / b * xx; swap(x, xx);
y -= a / b * yy; swap(y, yy);
a %= b; swap(a, b);
```

```
    }  
    return a;  
}
```

```
// Chinese remainder theorem
const pll NO_SOLUTION(0, -1);
// Returns (u, v) such that  $x = u \% v \iff x = a \% n$  and  $x = b$ 
```

```

↪ % m
p11 crt(ll a, ll n, ll b, ll m) {
    ll s, t, d = egcd(n, m, s, t), nm = n * m;
    if (d != 1) return -1;
    s %= m;
    if (s < 0) s += m;
    return (s * a) % m;
}

```

```

if (mod(a - b, d)) return NO_SOLUTION;
return pll(mod(s * b * n + t * a * m, nm) / d, nm / d);

```

```

/* when n, m > 10^6, avoid overflow:
return pll(mod(mulmod(mulmod(s, b, nm), n, nm)
+ mulmod(mulmod(t, a, nm), m, nm), nm) / d, nm)

```

```

    ↪ / d); */
}

```

```
(( phi[i] = # { 0 ≤ j ≤ i | gcd(j, i) = 1 } )
```

```
v1 totient(int N) {
```

```
for (int i = 0; i < N; i++) phi[i] = i;
for (int i = 2; i < N; i++)
```

```
for (int i = 1; i < N; i += i) phi[i] -= phi[i] / i;
```

```
return phi;
}
```

```
// calculate  $nCk \% p$  ( $p$  prime!)
```

```
ll lucas(ll n, ll k, ll p) {
```

```
while (n) {
```

```

    ll np = n % p, kp = k % p;
    if (np < kp) return 0;
    ans = mod(ans * binom(np, kp), p); // (np C kp)
    n /= p; k /= p;
}
return ans;
}

```

```
// returns if n is prime for n < 3e24 ( > 2^64)
```

```
bool millerRabin(ll n){
    if (n < 2 || n % 2 == 0) return n == 2;
    ll d = n - 1, ad, s = 0, r;
    for (; d % 2 == 0; d /= 2) s++;
    for (int a : { 2, 3, 5, 7, 11, 13, 17, 19, 23, 29, 31, 37,
        ↪ 41 }) {
```

## 2. DATASTRUCTURES

```
1 typedef /* Tree element */ S;  
2 const int n = 1 << 20; S t[2 * n];
```

```
8 void build() { for (int i = n; --i; ) t[i] = combine(t[2 * i],  
    ↪ t[2 * i + 1]); }
```

```
14 // sum on interval [l, r)
```

### 2.2. Binary Indexed Tree $\mathcal{O}(\log n)$ . Use one-based indices ( $i > 0$ )!

```
8 // returns sum of arr[i], where i: [1, i]
```

### 2.3. Disjoint-Set / Union-Find $\mathcal{O}(\alpha(n))$ .

```

1  int par[MAXN], rnk[MAXN];
2
3  void uf_init(int n) {
4      fill_n(par, n, -1); fill_n(rnk, n, 0);
5  }
6
7  int uf_find(int v) { return par[v] < 0 ? v : par[v] =
    ↪ uf_find(par[v]); }

```

```

void uf_union(int a, int b) {
    if ((a = uf_find(a)) == (b = uf_find(b))) return;
    if (rnk[a] < rnk[b]) swap(a, b);
    if (rnk[a] == rnk[b]) rnk[a]++;
    par[b] = a;
}

```

### 3. GRAPH ALGORITHMS

3.1. **Maximum matching**  $\mathcal{O}(nm)$ . This problem could be solved with a flow algorithm like Dinic's algorithm which runs in  $\mathcal{O}(\sqrt{V}E)$ , too.

```
const int sizeL = 1e4, sizeR = 1e4;
```

```

bool vis[sizeR];
int par[sizeR]; // par : R -> L
vi adj[sizeL]; // adj : L -> (N -> R)

```

```

bool match(int u) {
    for (int v : adj[u]) {
        if (vis[v]) continue; vis[v] = true;
        if (par[v] == -1 || match(par[v])) {
            par[v] = u;
            return true;
        }
    }
    return false;
}

```

// perfect matching iff ret == sizeL == sizeR

```

int maxmatch() {
    fill_n(par, sizeR, -1); int ret = 0;
    for (int i = 0; i < sizeL; i++) {
        fill_n(vis, sizeR, false);
        ret += match(i);
    }
    return ret;
}

```

3.2. **Strongly Connected Components**  $\mathcal{O}(V + E)$ .

```

vvi adj, comps; vi tidx, lnk, cnr, st; vector<bool> vis; int
    ↪ age, ncomps;

```

```

void tarjan(int v) {
    tidx[v] = lnk[v] = ++age; vis[v] = true; st.pb(v);

    for (int w : adj[v]) {
        if (!tidx[w]) tarjan(w), lnk[v] = min(lnk[v], lnk[w]);
        else if (vis[w]) lnk[v] = min(lnk[v], tidx[w]);
    }

    if (lnk[v] != tidx[v]) return;

    comps.pb(vi()); int w;
    do {
        vis[w = st.back()] = false; cnr[w] = ncomps;
        ↪ comps.back().pb(w);
        st.pop_back();
    } while (st.size());
}

```

```

    } while (w != v);
    ncomps++;
}

void findSCC(int n) {
    age = ncomps = 0; vis.assign(n, false); tidx.assign(n, 0);
    ↪ lnk.resize(n);
    cnr.resize(n); comps.clear();

    for (int i = 0; i < n; i++)
        if (tidx[i] == 0) tarjan(i);
}

```

3.2.1. **2-SAT**  $\mathcal{O}(V + E)$ . Include findSCC.

```

1 void init2sat(int n) { adj.assign(2 * n, vi()); }
2
3 // vl, vr = true -> variable l, variable r should be negated.
4 void imply(int xl, bool vl, int xr, bool vr) {
5     adj[2 * xl + vl].pb(2 * xr + vr); adj[2 * xr + !vr].pb(2 * xl
6     ↪ +!vl); }
7
8 void sat0r(int xl, bool vl, int xr, bool vr) { imply(xl, !vl,
9     ↪ xr, vr); }
10 void satConst(int x, bool v) { imply(x, !v, x, v); }
11 void sat1ff(int xl, bool vl, int xr, bool vr) {
12     imply(xl, vl, xr, vr); imply(xr, vr, xl, vl); }
13
14 bool solve2sat(int n, vector<bool> &sol) {
15     findSCC(2 * n);
16     for (int i = 0; i < n; i++)
17         if (cnr[2 * i] == cnr[2 * i + 1]) return false;
18     vector<bool> seen(n, false); sol.assign(n, false);
19     for (vi &comp : comps) {
20         for (int v : comp) {
21             if (seen[v / 2]) continue;
22             seen[v / 2] = true; sol[v / 2] = v & 1;
23         }
24     }
25     return true;
26 }

```

3.3. **Cycle Detection**  $\mathcal{O}(V + E)$ .

```

vvi adj; // assumes bidirected graph, adjust accordingly

bool cycle_detection() {
    stack<int> s; vector<bool> vis(MAXN, false); vi par(MAXN,
    ↪ -1); s.push(0);
    vis[0] = true;
    while (!s.empty()) {
        int cur = s.top(); s.pop();
        for (int i : adj[cur]) {
            if (vis[i] && par[cur] != i) return true;
            s.push(i); par[i] = cur; vis[i] = true;
        }
    }
    return false;
}

```

3.4. **Shortest path.**

3.4.1. **Dijkstra**  $\mathcal{O}(E + V \log V)$ .

3.4.2. **Floyd-Warshall**  $\mathcal{O}(V^3)$ .

```

1 int n = 100; ll d[MAXN][MAXN];
2 for (int i = 0; i < n; i++) fill_n(d[i], n, 1e18);
3 // set direct distances from i to j in d[i][j] (and d[j][i])
4 for (int i = 0; i < n; i++)
5     for (int j = 0; j < n; j++)
6         for (int k = 0; k < n; k++)
7             d[j][k] = min(d[j][k], d[j][i] + d[i][k]);

```

3.4.3. **Bellman Ford**  $\mathcal{O}(VE)$ . This is only useful if there are edges with weight  $w_{ij} < 0$  in the graph.

```

1 vector<pair<pii, ll>> edges; // ((from, to), weight)
2 vector<ll> dist;
3
4 // when undirected, add back edges
5 bool bellman_ford(int V, int source) {
6     dist.assign(V, 1e18); dist[source] = 0;
7
8     bool updated = true; int loops = 0;
9     while (updated && loops < n) {
10         updated = false;
11         for (auto e : edges) {
12             int alt = dist[e.x.x] + e.y;
13             if (alt < dist[e.x.y]) {
14                 dist[e.x.y] = alt; updated = true;
15             }
16         }
17     }
18     return loops < n; // loops >= n: negative cycles
19 }

```

3.5. **Max-flow min-cut.**

3.5.1. **Dinic's Algorithm**  $\mathcal{O}(V^2E)$ .

```

1 struct edge {
2     int to, rev; ll cap, flow;
3     edge(int t, int r, ll c) : to(t), rev(r), cap(c), flow(0) {}
4 };
5
6 int s, t, level[MAXN]; // s = source, t = sink
7 vector<edge> g[MAXN];
8
9 void add_edge(int fr, int to, ll cap) {
10     g[fr].pb(edge(to, g[to].size(), cap)); g[to].pb(edge(fr,
11     ↪ g[fr].size() - 1, 0));
12 }
13
14 bool dinic_bfs() {
15     fill_n(level, MAXN, 0); level[s] = 1;
16
17     queue<int> q; q.push(s);
18     while (!q.empty()) {
19         int cur = q.front(); q.pop();
20         for (edge e : g[cur]) {
21             if (level[e.to] == 0 && e.flow < e.cap) {
22                 level[e.to] = level[cur] + 1; q.push(e.to);

```

```

    }
}
return level[t] != 0;
}

ll dinic_dfs(int cur, ll maxf) {
    if (cur == t) return maxf;

    ll f = 0; bool isSat = true;
    for (edge &e : g[cur]) {
        if (level[e.to] != level[cur] + 1 || e.flow >= e.cap)
            continue;
        ll df = dinic_dfs(e.to, min(maxf - f, e.cap - e.flow));
        f += df; e.flow += df; g[e.to][e.rev].flow -= df; isSat &= f == e.cap;
        if (maxf == f) break;
    }
    if (isSat) level[cur] = 0;
    return f;
}

ll dinic_maxflow() {
    ll f = 0;
    while (dinic_bfs()) f += dinic_dfs(s, LLINF);
    return f;
}

```

3.6. **Min-cost max-flow.** Find the cheapest possible way of sending a certain amount of flow through a flow network.

```

struct edge {
    // to, rev, flow, capacity, weight
    int t, r; ll f, c, w;
    edge(int _t, int _r, ll _c, ll _w) : t(_t), r(_r), f(0), c(_c), w(_w) {}
};

int n, par[MAXN]; vector<edge> adj[MAXN]; ll dist[MAXN];

bool findPath(int s, int t) {
    fill_n(dist, n, LLINF); fill_n(par, n, -1);

    priority_queue< pii, vector<pii>, greater<pii> > q;
    q.push(pii(dist[s] = 0, s));

    while (!q.empty()) {
        int d = q.top().x, v = q.top().y; q.pop();
        if (d > dist[v]) continue;

        for (edge e : adj[v]) {
            if (e.f < e.c && d + e.w < dist[e.t]) {
                q.push(pii(dist[e.t] = d + e.w, e.t)); par[e.t] = e.r;
            }
        }
        return dist[t] < INF;
    }
}

pair<ll, ll> minCostMaxFlow(int s, int t) {

```

```

    ll cost = 0, flow = 0;
    while (findPath(s, t)) {
        ll f = INF, c = 0; int cur = t;
        while (cur != s) {
            const edge &rev = adj[cur][par[cur]], &e =
            ↪ adj[rev.t][rev.r];
            f = min(f, e.c - e.f); cur = rev.t;
        }
        cur = t;
        while (cur != s) {
            edge &rev = adj[cur][par[cur]], &e = adj[rev.t][rev.r];
            c += e.w; e.f += f; rev.f -= f; cur = rev.t;
        }
        cost += f * c; flow += f;
    }
    return pair<ll, ll>(cost, flow);
}

inline void addEdge(int from, int to, ll cap, ll weight) {
    adj[from].pb(edge(to, adj[to].size(), cap, weight));
    adj[to].pb(edge(from, adj[from].size() - 1, 0, -weight));
}

```

### 3.7. Minimal Spanning Tree.

3.7.1. *Kruskal*  $\mathcal{O}(E \log V)$ .

## 4. STRING ALGORITHMS

### 4.1. Trie.

```

const int SIGMA = 26;

struct trie {
    bool word; trie **adj;

    trie() : word(false), adj(new trie*[SIGMA]) {
        for (int i = 0; i < SIGMA; i++) adj[i] = NULL;
    }

    void addWord(const string &str) {
        trie *cur = this;
        for (char ch : str) {
            int i = ch - 'a';
            if (!cur->adj[i]) cur->adj[i] = new trie();
            cur = cur->adj[i];
        }
        cur->word = true;
    }

    bool isWord(const string &str) {
        trie *cur = this;
        for (char ch : str) {
            int i = ch - 'a';
            if (!cur->adj[i]) return false;
            cur = cur->adj[i];
        }
        return cur->word;
    }
};

```

### 4.2. Z-algorithm $\mathcal{O}(n)$ .

```

// z[i] = length of longest substring starting from s[i] which
↪ is also a prefix of s.
vi z_function(const string &s) {
    int n = (int) s.length();
    vi z(n);
    for (int i = 1, l = 0, r = 0; i < n; ++i) {
        if (i <= r) z[i] = min(r - i + 1, z[i - l]);
        while (i + z[i] < n && s[z[i]] == s[i + z[i]]) ++z[i];
        if (i + z[i] - 1 > r) l = i, r = i + z[i] - 1;
    }
    return z;
}

```

4.3. **Suffix array**  $\mathcal{O}(n \log^2 n)$ . This creates an array  $P[0], P[1], \dots, P[n-1]$  such that the suffix  $S[i \dots n]$  is the  $P[i]^{th}$  suffix of  $S$  when lexicographically sorted.

```

typedef pair<pii, int> tii;
const int maxlogn = 17, int maxn = 1 << maxlogn;

tii make_triple(int a, int b, int c) { return tii(pii(a, b),
↪ c); }

int p[maxlogn + 1][maxn]; tii L[maxn];

int suffixArray(string S) {
    int N = S.size(), stp = 1, cnt = 1;
    for (int i = 0; i < N; i++) p[0][i] = S[i];
    for (; cnt < N; stp++, cnt <= 1) {
        for (int i = 0; i < N; i++)
            L[i] = tii(pii(p[stp-1][i], i + cnt < N ? p[stp-1][i +
            ↪ cnt] : -1), i);
        sort(L, L + N);
        for (int i = 0; i < N; i++)
            p[stp][L[i].y] = i > 0 && L[i].x == L[i-1].x ?
            ↪ p[stp][L[i-1].y] : i;
        return stp - 1; // result is in p[stp - 1][0 .. (N - 1)]
    }
}

```

4.4. **Longest Common Subsequence**  $\mathcal{O}(n^2)$ . SUBSTRING: consecutive characters!!!

```

int dp[STR_SIZE][STR_SIZE]; // DP problem

int lcs(const string &w1, const string &w2) {
    int n1 = w1.size(), n2 = w2.size();
    for (int i = 0; i < n1; i++) {
        for (int j = 0; j < n2; j++) {
            if (i == 0 || j == 0) dp[i][j] = 0;
            else if (w1[i - 1] == w2[j - 1]) dp[i][j] = dp[i - 1][j
            ↪ - 1] + 1;
            else dp[i][j] = max(dp[i - 1][j], dp[i][j - 1]);
        }
    }
    return dp[n1][n2];
}

```

```

}
// backtrack
string getLCS(const string &w1, const string &w2) {
    int i = w1.size(), j = w2.size(); string ret = "";
    while (i > 0 && j > 0) {
        if (w1[i - 1] == w2[j - 1]) ret += w1[--i], j--;
        else if (dp[i][j - 1] > dp[i - 1][j]) j--;
        else i--;
    }
    reverse(ret.begin(), ret.end());
    return ret;
}

4.5. Levenshtein Distance  $\mathcal{O}(n^2)$ . Also known as the 'Edit distance'.
int dp[MAX_SIZE][MAX_SIZE]; // DP problem

int levDist(const string &w1, const string &w2) {
    int n1 = w1.size(), n2 = w2.size();
    for (int i = 0; i <= n1; i++) dp[i][0] = i; // removal
    for (int j = 0; j <= n2; j++) dp[0][j] = j; // insertion
    for (int i = 1; i <= n1; i++)
        for (int j = 1; j <= n2; j++)
            dp[i][j] = min(
                1 + min(dp[i - 1][j], dp[i][j - 1]),
                dp[i - 1][j - 1] + (w1[i - 1] != w2[j - 1])
            );
    return dp[n1][n2];
}

4.6. Knuth-Morris-Pratt algorithm  $\mathcal{O}(N + M)$ .
int kmp_search(const string &word, const string &text) {
    int n = word.size();
    vi T(n + 1, 0);
    for (int i = 1, j = 0; i < n; ) {
        if (word[i] == word[j]) T[++i] = ++j; // match
        else if (j > 0) j = T[j]; // fallback
        else i++; // no match, keep zero
    }
    int matches = 0;
    for (int i = 0, j = 0; i < text.size(); ) {
        if (text[i] == word[j]) {
            i++;
            if (++j == n) { // match at interval [i - n, i)
                matches++; j = T[j];
            }
        } else if (j > 0) j = T[j];
        else i++;
    }
    return matches;
}

4.7. Aho-Corasick Algorithm  $\mathcal{O}(N + \sum_{i=1}^m |S_i|)$ . All given P must be
unique!
const int MAXP = 100, MAXLEN = 200, SIGMA = 26, MAXTRIE = MAXP
    * MAXLEN;

int nP;
string P[MAXP], S;

5. GEOMETRY

const double EPS = 1e-7, PI = acos(-1.0);

typedef long long NUM; // EITHER double OR long long
typedef pair<NUM, NUM> pt;
#define x first
#define y second

pt operator+(pt p, pt q) { return pt(p.x + q.x, p.y + q.y); }
pt operator-(pt p, pt q) { return pt(p.x - q.x, p.y - q.y); }

pt& operator+=(pt &p, pt q) { return p = p + q; }
pt& operator-=(pt &p, pt q) { return p = p - q; }

int pnr[MAXTRIE], to[MAXTRIE][SIGMA], sLink[MAXTRIE],
    dLink[MAXTRIE], nnodes;

void ahoCorasick() {
    fill_n(pnr, MAXTRIE, -1);
    for (int i = 0; i < MAXTRIE; i++) fill_n(to[i], SIGMA, 0);
    fill_n(sLink, MAXTRIE, 0); fill_n(dLink, MAXTRIE, 0);
    nnodes = 1;
    // STEP 1: MAKE A TREE
    for (int i = 0; i < nP; i++) {
        int cur = 0;
        for (char c : P[i]) {
            int i = c - 'a';
            if (to[cur][i] == 0) to[cur][i] = nnodes++;
            cur = to[cur][i];
        }
        pnr[cur] = i;
    }
    // STEP 2: CREATE SUFFIX_LINKS AND DICT_LINKS
    queue<int> q; q.push(0);
    while (!q.empty()) {
        int cur = q.front(); q.pop();
        for (int c = 0; c < SIGMA; c++) {
            if (to[cur][c]) {
                int sl = sLink[to[cur][c]] = cur == 0 ? 0 :
                    to[sLink[cur]][c];
                // if all strings have equal length, remove this:
                dLink[to[cur][c]] = pnr[sl] >= 0 ? sl : dLink[sl];
                q.push(to[cur][c]);
            } else to[cur][c] = to[sLink[cur]][c];
        }
    }
    // STEP 3: TRAVERSE S
    for (int cur = 0, i = 0, n = S.size(); i < n; i++) {
        cur = to[cur][S[i] - 'a'];
        for (int hit = pnr[cur] >= 0 ? cur : dLink[cur]; hit; hit =
            dLink[hit]) {
            cerr << P[pnr[hit]] << " found at [" << (i + 1 -
                P[pnr[hit]].size()) << ", " << i << "]" << endl;
        }
    }
}

6. GEOMETRY

bool collinear(pt a, pt b, pt c) { return ((a - b) ^ (a - c))
    == 0; }

bool pointOnSegment(pt a, pt b, pt c) {
    NUM dot = (a - b) * (c - b), len = (c - b) * (c - b);
    return collinear(a, b, c) && 0 <= dot && dot <= len;
}

// true => 1 intersection, false => parallel, so 0 or \infty
// solutions
bool linesIntersect(pt a, pt b, pt c, pt d) { return ((a - b)
    ^ (c - d)) != 0; }

```



```

vec lineLineIntersection(pt a, pt b, pt c, pt d) {
    double det = (a - b) ^ (c - d); pt ret = (c - d) * (a ^ b)
    ↪ (a - b) * (c ^ d);
    return vec(ret.x / det, ret.y / det);
}

// dp, dq are directions from p, q
// intersection at p + t_i dp, for 0 ≤ i < return value
int segmentIntersection(pt p, pt dp, pt q, pt dq, frac &t0,
    ↪ frac &t1){
    if (dp * dp == 0) swap(p, q), swap(dp, dq); // dq = 0
    if (dp * dp == 0) { t0 = t1 = frac(0, 1); return p == q; }
    ↪ // dp = dq = 0
    pt dpq = (q - p); NUM c = dp ^ dq, c0 = dpq ^ dp, c1 = dpq ^
    ↪ dq;
    if (c == 0) { // parallel, dp > 0, dq ≥ 0
        if (c0 != 0) return 0; // not collinear
        NUM v0 = dpq * dp, v1 = v0 + dq * dp, dp2 = dp * dp;
        if (v1 < v0) swap(v0, v1);
        t0 = frac(v0 = max(v0, (NUM) 0), dp2);
        t1 = frac(v1 = min(v1, dp2), dp2);
        return (v0 ≤ v1) + (v0 < v1);
    } else if (c < 0) c = -c, c0 = -c0, c1 = -c1;
    t0 = t1 = frac(c1, c);
    return 0 ≤ min(c0, c1) && max(c0, c1) ≤ c;
}

// Returns TWICE the area of a polygon to keep it an integer
NUM polygonTwiceArea(const vector<pt> &pts) {
    NUM area = 0;
    for (int N = pts.size(), i = 0, j = N - 1; i < N; j = i++)
        area += pts[i] ^ pts[j];
    return abs(area); // area < 0 ⇔ pts ccw
}

bool pointInPolygon(pt p, const vector<pt> &pts) {
    double sum = 0;
    for (int N = pts.size(), i = 0, j = N - 1; i < N; j = i++) {
        if (pointOnSegment(p, pts[i], pts[j])) return true; //
    ↪ boundary
        double angle = acos((pts[i] - p) * (pts[j] - p) /
    ↪ len(pts[i], p) / len(pts[j], p));
        sum += ((pts[i] - p) ^ (pts[j] - p)) < 0 ? angle :
    ↪ -angle;
    }
    return abs(abs(sum) - 2 * PI) < EPS;
}

5.1. Convex Hull  $\mathcal{O}(n \log n)$ .
// points are given by: pts[ret[0]], pts[ret[1]], ...
    ↪ pts[ret[ret.size()-1]]
vi convexHull(const vector<pt> &pts) {
    if (pts.empty()) return vi();
    vi ret;
    // find one outer point:
    int fsti = 0, n = pts.size(); pt fstpt = pts[0];
    for (int i = n; i--;) if (pts[i] < fstpt) fstpt = pts[fsti];
    ↪ i];
    ret.pb(fsti); pt refr = pts[fsti];
    vi ord; // index into pts
    for (int i = n; i--;) if (pts[i] != refr) ord.pb(i);
    sort(ord.begin(), ord.end(), [&pts, &refr] (int a, int b)
    ↪ bool {
        NUM cross = (pts[a] - refr) ^ (pts[b] - refr);
        return cross != 0 ? cross > 0 : lenSq(refr, pts[a]) <
    ↪ lenSq(refr, pts[b]);
    });
    for (int i : ord) {
        // NOTE: > INCLUDES points on the hull-line, ≥ EXCLUDES
        while (ret.size() > 1 &&
            ((pts[ret[ret.size()-2]] - pts[ret.back()]) ^
    ↪ (pts[i] - pts[ret.back()])) ≥ 0)
            ret.pop_back();
        ret.pb(i);
    }
    return ret;
}

5.2. Rotating Calipers  $\mathcal{O}(n)$ . Finds the longest distance between two
points in a convex hull.
NUM rotatingCalipers(vector<pt> &hull) {
    int n = hull.size(), a = 0, b = 1;
    if (n ≤ 1) return 0.0;
    while (((hull[1] - hull[0]) ^ (hull[(b + 1) % n] - hull[b]))
    ↪ > 0) b++;
    NUM ret = 0.0;
    while (a < n) {
        ret = max(ret, lenSq(hull[a], hull[b]));
        if (((hull[(a + 1) % n] - hull[a % n]) ^ (hull[(b + 1) %
    ↪ n] - hull[b])) ≤ 0) a++;
        else if (++b == n) b = 0;
    }
    return ret;
}

5.3. Closest points  $\mathcal{O}(n \log n)$ .
int n; pt pts[maxn];

struct byY {
    bool operator()(int a, int b) const { return pts[a].y <
    ↪ pts[b].y; }
};

inline NUM dist(pii p) {
    return hypot(pts[p.x].x - pts[p.y].x, pts[p.x].y -
    ↪ pts[p.y].y);
}

pii minpt(pii p1, pii p2) { return (dist(p1) < dist(p2)) ? p1
    ↪ : p2; }

// closest pts (by index) inside pts[l ... r], with sorted y
    ↪ values in ys
pii closest(int l, int r, vi &ys) {
    if (r - l == 2) { // don't assume 1 here.
        ys = { l, l + 1 };
        return pii(l, l + 1);
    } else if (r - l == 3) { // brute-force
        ys = { l, l + 1, l + 2 };
        sort(ys.begin(), ys.end(), byY());
        return minpt(pii(l, l + 1), minpt(pii(l, l + 2), pii(l +
    ↪ 1, l + 2)));
    }
    int m = (l + r) / 2; vi yl, yr;
    pii delta = minpt(closest(l, m, yl), closest(m, r, yr));
    NUM ddelta = dist(delta), xm = .5 * (pts[m-1].x + pts[m].x);
    merge(yl.begin(), yl.end(), yr.begin(), yr.end(),
    ↪ back_inserter(ys), byY());
    deque<int> q;
    for (int i : ys) {
        if (abs(pts[i].x - xm) ≤ ddelta) {
            for (int j : q) delta = minpt(delta, pii(i, j));
            q.pb(i);
            if (q.size() > 8) q.pop_front(); // magic from
    ↪ Introduction to Algorithms.
        }
    }
    return delta;
}

6. MISCELLANEOUS

6.1. Binary search  $\mathcal{O}(\log(h_i - l_o))$ .
bool test(int n);

int search(int lo, int hi) {
    // assert(test(lo) && !test(hi));
    while (hi - lo > 1) {
        int m = (lo + hi) / 2;
        (test(m) ? lo : hi) = m;
    }
    // assert(test(lo) && !test(hi));
    return lo;
}

6.2. Fast Fourier Transform  $\mathcal{O}(n \log n)$ . Given two polynomials
 $A(x) = a_0 + a_1x + \dots + a_{n/2}x^{n/2}$  and  $B(x) = b_0 + b_1x + \dots + b_{n/2}x^{n/2}$ ,
FFT calculates all coefficients of  $C(x) = A(x) \cdot B(x) = c_0 + c_1x + \dots + c_nx^n$ ,
with  $c_i = \sum_{j=0}^i a_j b_{i-j}$ .

typedef complex<double> cpx;
const int logmaxn = 20, maxn = 1 << logmaxn;

cpx a[maxn] = {}, b[maxn] = {}, c[maxn];

void fft(cpx *src, cpx *dest) {
    for (int i = 0, rep = 0; i < maxn; i++, rep = 0) {
        for (int j = i, k = logmaxn; k--; j >>= 1) rep = (rep <<
    ↪ 1) | (j & 1);
        dest[rep] = src[i];
    }
    for (int s = 1, m = 1; m ≤ maxn; s++, m *= 2) {
        cpx r = exp(cpx(0, 2.0 * PI / m));
        for (int k = 0; k < maxn; k += m) {

```

```

    cpx cr(1.0, 0.0);
    for (int j = 0; j < m / 2; j++) {
        cpx t = cr * dest[k + j + m / 2]; dest[k + j + m / 2]
↪ = dest[k + j] - t;
        dest[k + j] += t; cr *= r;
    }
}

void multiply() {
    fft(a, c); fft(b, a);
    for (int i = 0; i < maxn; i++) b[i] = conj(a[i] * c[i]);
    fft(b, c);
    for (int i = 0; i < maxn; i++) c[i] = conj(c[i]) / (1.0 *
↪ maxn);
}

6.3. Minimum Assignment (Hungarian Algorithm)  $\mathcal{O}(n^3)$ .
int a[MAXN + 1][MAXM + 1]; // matrix, 1-based

int minimum_assignment(int n, int m) { // n rows, m columns
    vi u(n + 1), v(m + 1), p(m + 1), way(m + 1);

    for (int i = 1; i <= n; i++) {
        p[0] = i;
        int j0 = 0;
        vi minv(m + 1, INF);
        vector<char> used(m + 1, false);
        do {
            used[j0] = true;
            int i0 = p[j0], delta = INF, j1;
            for (int j = 1; j <= m; j++)
                if (!used[j]) {
                    int cur = a[i0][j] - u[i0] - v[j];
                    if (cur < minv[j]) minv[j] = cur, way[j] = j0;
                    if (minv[j] < delta) delta = minv[j], j1 = j;
                }
            for (int j = 0; j <= m; j++) {
                if (used[j]) u[p[j]] += delta, v[j] -= delta;
                else minv[j] -= delta;
            }
            j0 = j1;
        } while (p[j0] != 0);
        do {
            int j1 = way[j0]; p[j0] = p[j1]; j0 = j1;
        } while (j0);
    }

    // column j is assigned to row p[j]
    // for (int j = 1; j <= m; ++j) ans[p[j]] = j;
    return -v[0];
}

```

6.4. Partial linear equation solver  $\mathcal{O}(N^3)$ .

```
typedef double NUM;
```

```
#define MAXN 110
```

```

4  #define EPS 1e-5
5
6  NUM mat[MAXN][MAXN + 1], vals[MAXN]; bool hasval[MAXN];
7
8  bool is_zero(NUM a) { return -EPS < a && a < EPS; }
9  bool eq(NUM a, NUM b) { return is_zero(a - b); }
10
11 int solvemmat(int n) { //mat[i][j] contains the matrix A,
↪ mat[i][n] contains b
12     int pivrow = 0, pivcol = 0;
13     while (pivcol < n) {
14         int r = pivrow, c;
15         while (r < n && is_zero(mat[r][pivcol])) r++;
16         if (r == n) { pivcol++; continue; }
17
18         for (c = 0; c <= n; c++) swap(mat[pivrow][c], mat[r][c]);
19
20         r = pivrow++; c = pivcol++;
21         NUM div = mat[r][c];
22         for (int col = c; col <= n; col++) mat[r][col] /= div;
23         for (int row = 0; row < n; row++) {
24             if (row == r) continue;
25             NUM times = -mat[row][c];
26             for (int col = c; col <= n; col++) mat[row][col] +=
↪ times * mat[r][col];
27         }
28     } // now mat is in RREF
29
30     for (int r = pivrow; r < n; r++)
31         if (!is_zero(mat[r][n])) return 0;
32
33     fill_n(hasval, n, false);
34     for (int col = 0, row; col < n; col++) {
35         hasval[col] = !is_zero(mat[row][col]);
36         if (!hasval[col]) continue;
37         for (int c = col + 1; c < n; c++) {
38             if (!is_zero(mat[row][c])) hasval[col] = false;
39         }
40         if (hasval[col]) vals[col] = mat[row][n];
41         row++;
42     }
43
44     for (int i = 0; i < n; i++)
45         if (!hasval[i]) return 2;
46     return 1;
47 }

```

## 7. USEFUL INFORMATION

## 8. MISC

## 8.1. Debugging Tips.

- Stack overflow? Recursive DFS on tree that is actually a long path?
- Floating-point numbers
  - Getting NaN? Make sure `acos` etc. are not getting values out of their range (perhaps `1+eps`).
  - Rounding negative numbers?
  - Outputting in scientific notation?
- Wrong Answer?
  - Read the problem statement again!
  - Are multiple test cases being handled correctly? Try repeating the same test case many times.
  - Integer overflow?
  - Think very carefully about boundaries of all input parameters
  - Try out possible edge cases:
    - \*  $n = 0, n = -1, n = 1, n = 2^{31} - 1$  or  $n = -2^{31}$
    - \* List is empty, or contains a single element
    - \*  $n$  is even,  $n$  is odd
    - \* Graph is empty, or contains a single vertex
    - \* Graph is a multigraph (loops or multiple edges)
    - \* Polygon is concave or non-simple
  - Is initial condition wrong for small cases?
  - Are you sure the algorithm is correct?
  - Explain your solution to someone.
  - Are you using any functions that you don't completely understand? Maybe STL functions?
  - Maybe you (or someone else) should rewrite the solution?
  - Can the input line be empty?
- Run-Time Error?
  - Is it actually Memory Limit Exceeded?

## 8.2. Solution Ideas.

- Dynamic Programming
  - Parsing CFGs: CYK Algorithm
  - Drop a parameter, recover from others
  - Swap answer and a parameter
  - When grouping: try splitting in two
  - $2^k$  trick
  - When optimizing
    - \* Convex hull optimization
      - $dp[i] = \min_{j < i} \{dp[j] + b[j] \times a[i]\}$
      - $b[j] \geq b[j + 1]$
      - optionally  $a[i] \leq a[i + 1]$
      - $O(n^2)$  to  $O(n)$
    - \* Divide and conquer optimization
      - $dp[i][j] = \min_{k < j} \{dp[i - 1][k] + C[k][j]\}$
      - $A[i][j] \leq A[i][j + 1]$
      - $O(kn^2)$  to  $O(kn \log n)$
      - sufficient:  $C[a][c] + C[b][d] \leq C[a][d] + C[b][c]$ ,  $a \leq b \leq c \leq d$  (QI)
    - \* Knuth optimization
      - $dp[i][j] = \min_{i < k < j} \{dp[i][k] + dp[k][j] + C[i][j]\}$
      - $A[i][j - 1] \leq A[i][j] \leq A[i + 1][j]$
      - $O(n^3)$  to  $O(n^2)$
      - sufficient: QI and  $C[b][c] \leq C[a][d]$ ,  $a \leq b \leq c \leq d$
- Greedy

- Randomized
- Optimizations
  - Use bitset (/64)
  - Switch order of loops (cache locality)
- Process queries offline
  - Mo's algorithm
- Square-root decomposition
- Precomputation
- Efficient simulation
  - Mo's algorithm
  - Sqrt decomposition
  - Store  $2^k$  jump pointers
- Data structure techniques
  - Sqrt buckets
  - Store  $2^k$  jump pointers
  - $2^k$  merging trick
- Counting
  - Inclusion-exclusion principle
  - Generating functions
- Graphs
  - Can we model the problem as a graph?
  - Can we use any properties of the graph?
  - Strongly connected components
  - Cycles (or odd cycles)
  - Bipartite (no odd cycles)
    - \* Bipartite matching
    - \* Hall's marriage theorem
    - \* Stable Marriage
  - Cut vertex/bridge
  - Biconnected components
  - Degrees of vertices (odd/even)
  - Trees
    - \* Heavy-light decomposition
    - \* Centroid decomposition
    - \* Least common ancestor
    - \* Centers of the tree
  - Eulerian path/circuit
  - Chinese postman problem
  - Topological sort
  - (Min-Cost) Max Flow
  - Min Cut
    - \* Maximum Density Subgraph
  - Huffman Coding
  - Min-Cost Arborescence
  - Steiner Tree
  - Kirchoff's matrix tree theorem
  - Prüfer sequences
  - Lovász Toggle
  - Look at the DFS tree (which has no cross-edges)
  - Is the graph a DFA or NFA?
    - \* Is it the Synchronizing word problem?
- Mathematics
  - Is the function multiplicative?
  - Look for a pattern
  - Permutations
    - \* Consider the cycles of the permutation
  - Functions
    - \* Sum of piecewise-linear functions is a piecewise-linear function
    - \* Sum of convex (concave) functions is convex (concave)
- Modular arithmetic
  - \* Chinese Remainder Theorem
  - \* Linear Congruence
- Sieve
- System of linear equations
- Values too big to represent?
  - \* Compute using the logarithm
  - \* Divide everything by some large value
- Linear programming
  - \* Is the dual problem easier to solve?
- Can the problem be modeled as a different combinatorial problem? Does that simplify calculations?
- Logic
  - 2-SAT
  - XOR-SAT (Gauss elimination or Bipartite matching)
- Meet in the middle
- Only work with the smaller half ( $\log(n)$ )
- Strings
  - Trie (maybe over something weird, like bits)
  - Suffix array
  - Suffix automaton (+DP?)
  - Aho-Corasick
  - eerTree
  - Work with  $S + S$
- Hashing
- Euler tour, tree to array
- Segment trees
  - Lazy propagation
  - Persistent
  - Implicit
  - Segment tree of X
- Geometry
  - Minkowski sum (of convex sets)
  - Rotating calipers
  - Sweep line (horizontally or vertically?)
  - Sweep angle
  - Convex hull
- Fix a parameter (possibly the answer).
- Are there few distinct values?
- Binary search
- Sliding Window (+ Monotonic Queue)
- Computing a Convolution? Fast Fourier Transform
- Computing a 2D Convolution? FFT on each row, and then on each column
- Exact Cover (+ Algorithm X)
- Cycle-Finding
- What is the smallest set of values that identify the solution? The cycle structure of the permutation? The powers of primes in the factorization?
- Look at the complement problem
  - Minimize something instead of maximizing
- Immediately enforce necessary conditions. (All values greater than 0? Initialize them all to 1)
- Add large constant to negative numbers to make them positive
- Counting/Bucket sort



9. FORMULAS

- **Legendre symbol:**  $\left(\frac{a}{b}\right) = a^{(b-1)/2} \pmod{b}$ ,  $b$  odd prime.
- **Heron's formula:** A triangle with side lengths  $a, b, c$  has area  $\sqrt{s(s-a)(s-b)(s-c)}$  where  $s = \frac{a+b+c}{2}$ .
- **Pick's theorem:** A polygon on an integer grid strictly containing  $i$  lattice points and having  $b$  lattice points on the boundary has area  $i + \frac{b}{2} - 1$ . (Nothing similar in higher dimensions)
- **Euler's totient:** The number of integers less than  $n$  that are coprime to  $n$  are  $n \prod_{p|n} \left(1 - \frac{1}{p}\right)$  where each  $p$  is a distinct prime factor of  $n$ .
- **König's theorem:** In any bipartite graph  $G = (L \cup R, E)$ , the number of edges in a maximum matching is equal to the number of vertices in a minimum vertex cover. Let  $U$  be the set of unmatched vertices in  $L$ , and  $Z$  be the set of vertices that are either in  $U$  or are connected to  $U$  by an alternating path. Then  $K = (L \setminus Z) \cup (R \cap Z)$  is the minimum vertex cover.
- A minumum Steiner tree for  $n$  vertices requires at most  $n-2$  additional Steiner vertices.
- The number of vertices of a graph is equal to its minimum vertex cover number plus the size of a maximum independent set.
- **Lagrange polynomial** through points  $(x_0, y_0), \dots, (x_k, y_k)$  is  $L(x) = \sum_{j=0}^k y_j \prod_{\substack{0 \leq m \leq k \\ m \neq j}} \frac{x-x_m}{x_j-x_m}$
- **Hook length formula:** If  $\lambda$  is a Young diagram and  $h_\lambda(i, j)$  is the hook-length of cell  $(i, j)$ , then then the number of Young tableaux  $d_\lambda = n! / \prod h_\lambda(i, j)$ .
- **Möbius inversion formula:** If  $f(n) = \sum_{d|n} g(d)$ , then  $g(n) = \sum_{d|n} \mu(d) f(n/d)$ . If  $f(n) = \sum_{m=1}^n g(\lfloor n/m \rfloor)$ , then  $g(n) = \sum_{m=1}^n \mu(m) f(\lfloor \frac{n}{m} \rfloor)$ .
- #primitive pythagorean triples with hypotenuse  $< n$  approx  $n/(2\pi)$ .
- **Frobenius Number:** largest number which can't be expressed as a linear combination of numbers  $a_1, \dots, a_n$  with non-negative coefficients.  $g(a_1, a_2) = a_1 a_2 - a_1 - a_2$ ,  $N(a_1, a_2) = (a_1 - 1)(a_2 - 1)/2$ .  $g(d \cdot a_1, d \cdot a_2, a_3) = d \cdot g(a_1, a_2, a_3) + a_3(d - 1)$ . An integer  $x > (\max_i a_i)^2$  can be expressed in such a way iff.  $x \mid \gcd(a_1, \dots, a_n)$ .

9.1. Physics.

- **Snell's law:**  $\frac{\sin \theta_1}{v_1} = \frac{\sin \theta_2}{v_2}$

9.2. **Markov Chains.** A Markov Chain can be represented as a weighted directed graph of states, where the weight of an edge represents the probability of transitioning over that edge in one timestep. Let  $P^{(m)} = (p_{ij}^{(m)})$  be the probability matrix of transitioning from state  $i$  to state  $j$  in  $m$  timesteps, and note that  $P^{(1)}$  is the adjacency matrix of the graph. **Chapman-Kolmogorov:**  $p_{ij}^{(m+n)} = \sum_k p_{ik}^{(m)} p_{kj}^{(n)}$ . It follows that  $P^{(m+n)} = P^{(m)} P^{(n)}$  and  $P^{(m)} = P^m$ . If  $p^{(0)}$  is the initial probability distribution (a vector), then  $p^{(0)} P^{(m)}$  is the probability distribution after  $m$  timesteps.

The return times of a state  $i$  is  $R_i = \{m \mid p_{ii}^{(m)} > 0\}$ , and  $i$  is *aperiodic* if  $\gcd(R_i) = 1$ . A MC is aperiodic if any of its vertices is aperiodic. A MC is *irreducible* if the corresponding graph is strongly connected.

A distribution  $\pi$  is stationary if  $\pi P = \pi$ . If MC is irreducible then  $\pi_i = 1/\mathbb{E}[T_i]$ , where  $T_i$  is the expected time between two visits at  $i$ .  $\pi_j/\pi_i$  is the expected number of visits at  $j$  in between two consecutive visits at  $i$ . A MC is *ergodic* if  $\lim_{m \rightarrow \infty} p^{(0)} P^m = \pi$ . A MC is ergodic iff. it is irreducible and aperiodic.

A MC for a random walk in an undirected weighted graph (un-weighted graph can be made weighted by adding 1-weights) has

$p_{uv} = w_{uv} / \sum_x w_{ux}$ . If the graph is connected, then  $\pi_u = \sum_x w_{ux} / \sum_v \sum_x w_{vx}$ . Such a random walk is aperiodic iff. the graph is not bipartite.

An *absorbing* MC is of the form  $P = \begin{pmatrix} Q & R \\ 0 & I_r \end{pmatrix}$ . Let  $N = \sum_{m=0}^\infty Q^m = (I_t - Q)^{-1}$ . Then, if starting in state  $i$ , the expected number of steps till absorption is the  $i$ -th entry in  $N1$ . If starting in state  $i$ , the probability of being absorbed in state  $j$  is the  $(i, j)$ -th entry of  $NR$ . Many problems on MC can be formulated in terms of a system of recurrence relations, and then solved using Gaussian elimination.

9.3. **Burnside's Lemma.** Let  $G$  be a finite group that acts on a set  $X$ . For each  $g$  in  $G$  let  $X^g$  denote the set of elements in  $X$  that are fixed by  $g$ . Then the number of orbits

$$|X/G| = \frac{1}{|G|} \sum_{g \in G} |X^g|$$

$$Z(S_n) = \frac{1}{n} \sum_{l=1}^n a_l Z(S_{n-l})$$

9.4. **Bézout's identity.** If  $(x, y)$  is any solution to  $ax+by = d$  (e.g. found by the Extended Euclidean Algorithm), then all solutions are given by

$$\left(x + k \frac{b}{\gcd(a, b)}, y - k \frac{a}{\gcd(a, b)}\right)$$

9.5. Misc.

9.5.1. *Determinants and PM.*

$$\det(A) = \sum_{\sigma \in S_n} \text{sgn}(\sigma) \prod_{i=1}^n a_{i, \sigma(i)}$$

$$\text{perm}(A) = \sum_{\sigma \in S_n} \prod_{i=1}^n a_{i, \sigma(i)}$$

$$\begin{aligned} pf(A) &= \frac{1}{2^n n!} \sum_{\sigma \in S_{2n}} \text{sgn}(\sigma) \prod_{i=1}^n a_{\sigma(2i-1), \sigma(2i)} \\ &= \sum_{M \in \text{PM}(n)} \text{sgn}(M) \prod_{(i,j) \in M} a_{i,j} \end{aligned}$$

9.5.2. *BEST Theorem.* Count directed Eulerian cycles. Number of OST given by Kirchoff's Theorem (remove r/c with root)  $\# \text{OST}(G, r) \cdot \prod_v (d_v - 1)!$

9.5.3. *Primitive Roots.* Only exists when  $n$  is  $2, 4, p^k, 2p^k$ , where  $p$  odd prime. Assume  $n$  prime. Number of primitive roots  $\phi(\phi(n))$  Let  $g$  be primitive root. All primitive roots are of the form  $g^k$  where  $k, \phi(p)$  are coprime.  
 $k$ -roots:  $g^{i \cdot \phi(n)/k}$  for  $0 \leq i < k$

9.5.4. *Sum of primes.* For any multiplicative  $f$ :

$$S(n, p) = S(n, p-1) - f(p) \cdot (S(n/p, p-1) - S(p-1, p-1))$$

9.5.5. *Floor.*

$$\begin{aligned} \lfloor \lfloor x/y \rfloor / z \rfloor &= \lfloor x/(yz) \rfloor \\ x \% y &= x - y \lfloor x/y \rfloor \end{aligned}$$

## PRACTICE CONTEST CHECKLIST

- How many operations per second? Compare to local machine.
- What is the stack size?
- How to use printf/scanf with long long/long double?
- Are `__int128` and `__float128` available?
- Does MLE give RTE or MLE as a verdict? What about stack overflow?
- What is `RAND_MAX`?
- How does the judge handle extra spaces (or missing newlines) in the output?
- Look at documentation for programming languages.
- Try different programming languages: C++, Java and Python.
- Try the submit script.
- Try local programs: `i?python[23]`, `factor`.
- Try submitting with `assert(false)` and `assert(true)`.
- Return-value from `main`.
- Look for directory with sample test cases.
- Make sure printing works.
- Remove this page from the notebook.