

Federal University of Rio de Janeiro

UFRJ - World Finals

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Contest (1)

.bashrc

b()(g++ -DLOC -O2 -std=c++20 -Wall -W -Wfatal-errors \ -Wconversion -Wshadow -Wlogical-op \ -Wfloat-equal -o \$1 \$1.cpp)

d()(b \$@ -00 -q -D_GLIBCXX_DEBUG -fsanitize=address,undefined) run()(\$0 && echo start >&2 && time ./\$2) $hash-cpp() (sed -n $2','$3' p' $1 | sed '/^#w/d' | cpp -dD -P \$ -fpreprocessed | tr -d '[:space:]' | md5sum |cut -c-6)

Other compilation flags:

-Wformat=2 -Wshift-overflow=2 -Wcast-qual

-Wcast-align -Wduplicated-cond

-D GLIBCXX DEBUG PEDANTIC -D FORTIFY SOURCE=2

-fno-sanitize-recover -fstack-protector

Print optimization info: -fopt-info-all

Mathematics (2)

2.1 Recurrences

If $a_n = c_1 a_{n-1} + \cdots + c_k a_{n-k}$, and r_1, \ldots, r_k are distinct roots of $x^k - c_1 x^{k-1} - \cdots - c_k$, there are d_1, \ldots, d_k s.t.

$$a_n = d_1 r_1^n + \dots + d_k r_k^n.$$

Non-distinct roots r become polynomial factors, e.g. $a_n = (d_1 n + d_2) r^n.$

Trigonometry

$$\sin(v + w) = \sin v \cos w + \cos v \sin w$$
$$\cos(v + w) = \cos v \cos w - \sin v \sin w$$

$$\tan(v+w) = \frac{\tan v + \tan w}{1 - \tan v \tan w}$$
$$\sin v + \sin w = 2\sin\frac{v+w}{2}\cos\frac{v-w}{2}$$
$$\cos v + \cos w = 2\cos\frac{v+w}{2}\cos\frac{v-w}{2}$$

$$(V+W)\tan(v-w)/2 = (V-W)\tan(v+w)/2$$

where V, W are lengths of sides opposite angles v, w.

$$a\cos x + b\sin x = r\cos(x - \phi)$$
$$a\sin x + b\cos x = r\sin(x + \phi)$$

where $r = \sqrt{a^2 + b^2}$, $\phi = \operatorname{atan2}(b, a)$.

2.3 Geometry

2.3.1 Triangles

Side lengths: a, b, c

Semiperimeter:
$$p = \frac{a+b+c}{2}$$

Area: $A = \sqrt{p(p-a)(p-b)(p-c)}$

Circumradius: $R = \frac{abc}{4A}$

Inradius: $r = \frac{A}{}$

Length of median (divides triangle into two equal-area triangles): $m_a = \frac{1}{2}\sqrt{2b^2 + 2c^2 - a^2}$

Length of bisector (divides angles in two):

$$s_a = \sqrt{bc \left[1 - \left(\frac{a}{b+c}\right)^2\right]}$$

Law of sines: $\frac{\sin \alpha}{a} = \frac{\sin \beta}{b} = \frac{\sin \gamma}{c} = \frac{1}{2R}$ Law of cosines: $a^2 = b^2 + c^2 - 2bc\cos \alpha$

Law of tangents:
$$\frac{a+b}{a-b} = \frac{\tan \frac{\alpha+\beta}{2}}{\tan \frac{\alpha-\beta}{2}}$$

Pick's: 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)

2.3.2 Quadrilaterals

With side lengths a, b, c, d, diagonals e, f, diagonals angle θ , area A and magic flux $F = b^2 + d^2 - a^2 - c^2$:

$$4A = 2ef \cdot \sin \theta = F \tan \theta = \sqrt{4e^2f^2 - F^2}$$

For cyclic quadrilaterals the sum of opposite angles is 180°, ef = ac + bd, and $A = \sqrt{(p-a)(p-b)(p-c)(p-d)}$.

2.3.3 Spherical coordinates



$$\begin{aligned} x &= r \sin \theta \cos \phi & r &= \sqrt{x^2 + y^2 + z^2} \\ y &= r \sin \theta \sin \phi & \theta &= \arccos(z/\sqrt{x^2 + y^2 + z^2}) \\ z &= r \cos \theta & \phi &= \operatorname{atan2}(y, x) \end{aligned}$$

2.4 Derivatives/Integrals

$$\frac{d}{dx}\arcsin x = \frac{1}{\sqrt{1-x^2}} \qquad \frac{d}{dx}\arccos x = -\frac{1}{\sqrt{1-x^2}}$$

$$\frac{d}{dx}\tan x = 1 + \tan^2 x \qquad \frac{d}{dx}\arctan x = \frac{1}{1+x^2}$$

$$\int \tan ax = -\frac{\ln|\cos ax|}{a} \qquad \int x\sin ax = \frac{\sin ax - ax\cos ax}{a^2}$$

$$\int e^{-x^2} = \frac{\sqrt{\pi}}{2}\operatorname{erf}(x) \qquad \int xe^{ax}dx = \frac{e^{ax}}{a^2}(ax-1)$$

2.4.1 XOR sum

$$\bigoplus_{x=0}^{n-1} x = \{0, n-1, 1, n\}[n \operatorname{mod} 4]$$

$$\bigoplus_{x=l}^{r-1} x = \bigoplus_{a=0}^{r-1} a \oplus \bigoplus_{b=0}^{l-1} b$$

2.5Sums

$$c^{a} + c^{a+1} + \dots + c^{b} = \frac{c^{b+1} - c^{a}}{c - 1}, c \neq 1$$

$$1 + 2 + 3 + \dots + n = \frac{n(n+1)}{2}$$

$$1^{2} + 2^{2} + 3^{2} + \dots + n^{2} = \frac{n(2n+1)(n+1)}{6}$$

$$1^{3} + 2^{3} + 3^{3} + \dots + n^{3} = \frac{n^{2}(n+1)^{2}}{4}$$

$$1^{4} + 2^{4} + 3^{4} + \dots + n^{4} = \frac{n(n+1)(2n+1)(3n^{2} + 3n - 1)}{30}$$

2.6Series

$$e^{x} = 1 + x + \frac{x^{2}}{2!} + \frac{x^{3}}{3!} + \dots, (-\infty < x < \infty)$$

$$\ln(1+x) = x - \frac{x^{2}}{2} + \frac{x^{3}}{3} - \frac{x^{4}}{4} + \dots, (-1 < x \le 1)$$

$$\sqrt{1+x} = 1 + \frac{x}{2} - \frac{x^{2}}{8} + \frac{2x^{3}}{32} - \frac{5x^{4}}{128} + \dots, (-1 \le x \le 1)$$

$$\sin x = x - \frac{x^{3}}{3!} + \frac{x^{5}}{5!} - \frac{x^{7}}{7!} + \dots, (-\infty < x < \infty)$$

$$\cos x = 1 - \frac{x^{2}}{2!} + \frac{x^{4}}{4!} - \frac{x^{6}}{6!} + \dots, (-\infty < x < \infty)$$

2.7 Probability theory

Let X be a discrete random variable with probability $p_X(x)$ of assuming the value x. It will then have an expected value (mean) $\mu = \mathbb{E}(X) = \sum_{x} x p_X(x)$ and variance $\sigma^2 = V(X) = \mathbb{E}(X^2) - (\mathbb{E}(X))^2 = \sum_x (x - \mathbb{E}(X))^2 p_X(x)$ where σ is the standard deviation. If X is instead continuous it will have a probability density function $f_X(x)$ and the sums above will

instead be integrals with $p_X(x)$ replaced by $f_X(x)$.

Expectation is linear:

$$\mathbb{E}(aX + bY) = a\mathbb{E}(X) + b\mathbb{E}(Y)$$

For independent X and Y,

$$V(aX + bY) = a^2V(X) + b^2V(Y).$$

2.7.1 Discrete distributions Binomial distribution

The number of successes in n independent yes/no experiments, each which yields success with probability p is $\text{Bin}(n,p), n=1,2,\ldots,0\leq p\leq 1.$

$$p(k) = \binom{n}{k} p^k (1-p)^{n-k}$$

$$\mu = np, \ \sigma^2 = np(1-p)$$

Bin(n, p) is approximately Po(np) for small p.

2.8 Markov chains

A Markov chain is a discrete random process with the property that the next state depends only on the current state. Let X_1, X_2, \ldots be a sequence of random variables generated by the Markov process. Then there is a transition matrix $\mathbf{P} = (p_{ij})$, with $p_{ij} = \Pr(X_n = i | X_{n-1} = j)$, and $\mathbf{p}^{(n)} = \mathbf{P}^n \mathbf{p}^{(0)}$ is the probability distribution for X_n (i.e., $p_i^{(n)} = \Pr(X_n = i)$), where $\mathbf{p}^{(0)}$ is the initial distribution.

 π is a stationary distribution if $\pi = \pi \mathbf{P}$. If the Markov chain is *irreducible* (it is possible to get to any state from any state), then $\pi_i = \frac{1}{\mathbb{E}(T_i)}$ where $\mathbb{E}(T_i)$ is the expected time between two visits in state i. π_j/π_i is the expected number of visits in state j between two visits in state i.

For a connected, undirected and non-bipartite graph, where the transition probability is uniform among all neighbors, π_i is proportional to node i's degree.

A Markov chain is *ergodic* if the asymptotic distribution is independent of the initial distribution. A finite Markov chain is ergodic iff it is irreducible and *aperiodic* (i.e., the gcd of cycle lengths is 1). $\lim_{k\to\infty} \mathbf{P}^k = \mathbf{1}\pi$.

A Markov chain is an absorbing chain if

- 1. there is at least one absorbing state and
- 2. it is possible to go from any state to at least one absorbing state in a finite number of steps.

A Markov chain is an A-chain if the states can be partitioned into two sets \mathbf{A} and \mathbf{G} , such that all states in \mathbf{A} are absorbing $(p_{ii}=1)$, and all states in \mathbf{G} leads to an absorbing state in \mathbf{A} . The probability for absorption in state $i \in \mathbf{A}$, when the initial state is j, is $a_{ij} = p_{ij} + \sum_{k \in \mathbf{G}} a_{ik} p_{kj}$. The expected time until absorption, when the initial state is i, is

$$t_i = 1 + \sum_{k \in \mathbf{G}} p_{ki} t_k.$$

Data Structures (3)

pb-ds.h

Description: Faster/better hash maps, taken from teapot. And set (not multiset!) with support for finding the n'th element, and finding the index of an element.

```
Time: \mathcal{O}\left(\log N\right)
```

```
<br/>
<br/>
dits/extc++.h>
                                                     ef3b3c, 25 lines
const size t HXOR = std::mt19937 64(time(0))();
template<class T> struct SafeHash {
 size_t operator()(const T& x) const
   return std::hash<T>()(x ^ T(HXOR));
};
template <typename K, typename V, typename Hash = SafeHash<K>>
using hash_map = __gnu_pbds::gp_hash_table<K, V, Hash>;
template <typename K, typename Hash = SafeHash<K>>
using hash_set = hash_map<K, __gnu_pbds::null_type, Hash>;
template <typename K, typename V, typename Comp = std::less<K>>
using ordered_map = __gnu_pbds::tree<K, V, Comp,
 __gnu_pbds::rb_tree_tag,
 __gnu_pbds::tree_order_statistics_node_update>;
template <typename K, typename Comp = std::less<K>>
using ordered_set = ordered_map<K,__gnu_pbds::null_type,Comp>;
void example() {
 ordered_set<int> t, t2; t.insert(8);
 auto it = t.insert(10).first;
 assert(it == t.lower_bound(9));
 assert(t.order_of_key(10) == 1); // num strictly smaller
 assert(t.order_of_key(11) == 2);
 assert(*t.find_by_order(0) == 8);
 t.join(t2); // assuming T < T2 or T > T2, merge t2 into t
```

dsu-rollback.h

Description: Disjoint-set data structure with undo. **Usage:** int t = uf.time(); ...; uf.rollback(t); **Time:** $\mathcal{O}(\log(N))$

7ddf1d, 21 lines

```
struct RollbackUF {
 vector<int> e; vector<pair<int,int>> st;
 RollbackUF(int n) : e(n, -1) {}
 int size(int x) { return -e[find(x)]; }
 int find(int x) { return e[x] < 0 ? x : find(e[x]); }
 int time() { return st.size(); }
 void rollback(int t) { // hash-1
   for (int i = time(); i --> t;)
     e[st[i].first] = st[i].second;
    st.resize(t);
 \frac{1}{100} / \frac{1}{100} hash-1 = 30bb61
 bool unite(int a, int b) { // hash-2
   a = find(a), b = find(b);
   if (a == b) return false;
   if (e[a] > e[b]) swap(a, b);
   st.push_back({a, e[a]});
   st.push_back({b, e[b]});
   e[a] += e[b]; e[b] = a;
   return true;
 \frac{1}{2} / \frac{1}{2} = a7445e
```

monotonic-queue.h

Description: Supports pop and push queue-like, and add function adds a constant to all elements currently in the queue.

ime: $\mathcal{O}(1)$

```
template<typename T, typename Comp> struct monotonic_queue {
  int lo, hi; T S; // hash-1
  deque<pair<T, T>> q;
  monotonic_queue() : lo(0), hi(0), S(0) {}
  void push(T val) {
```

point-context.h

Description: Examples of Segment Tree

228ba0, 20 lines

```
struct seg_node {
 int val, int mi, ma;
 seq_node() : mi(INT_MAX), ma(INT_MIN), val(0) {}
 seg_node(int x) : mi(x), ma(x), val(x) {}
 void merge(const seg_node& 1, const seg_node& r) {
   val = 1.val + r.val;
   mi = min(1.mi, r.mi), ma = max(1.ma, r.ma);
 void update(int x) { mi = ma = val = x; }
 bool acc_min(int& acc, int x) const {
   if (x >= mi) return true;
   if (acc > mi) acc = mi;
   return false:
 bool acc max(int& acc, int x) const
   if (x <= ma) return true;
   if (acc < ma) acc = ma;
   return false;
};
```

rec-lazy-segtree.h

Description: Segment Tree with Lazy update (half-open interval).

Time: $\mathcal{O}\left(\lg(N)*Q\right)$

22037e, 48 lines

```
template<class T> struct segtree_range { // hash-1
 int N; vector<T> ts;
 segtree_range() {}
 segtree_range(int M) : segtree_range(vector<T>(M, T(0))) {}
 template<class Q> segtree_range(const vector<Q>& A) {
   const int N_ = int(A.size());
   N = (1 << __lg(2*N_-1)); ts.resize(2*N);
   for (int i = 0; i < N_{i} ++i) at (i) = T(A[i]);
   build();
 \frac{1}{100} / \frac{1}{100} hash - 1 = 37f0ae
 T& at(int a) { return ts[a + N]; }
 void build() { for (int a = N; --a; ) merge(a); }
 inline void push(int a) { ts[a].push(ts[2*a], ts[2*a+1]); }
 inline void merge(int a) { ts[a].merge(ts[2*a], ts[2*a+1]); }
 T query(int v, int 1, int r, int a, int b) { // hash-2
   if (1 >= b || r <= a) return T();
   if (1 >= a && r <= b) return ts[v];
   int m = (1 + r)/2; push(v); T t;
    t.merge(query(2*v, 1, m, a, b), query(2*v+1, m, r, a, b));
   return t;
  \frac{1}{2} / \frac{1}{2} = eb3198
 T query(int a, int b) { return query(1, 0, N, a, b); }
 template < class F, class... Args > void update (int v, int 1,
       int r, int a, int b, F f, Args&&... args) { // hash-3
    if (1 >= b \mid \mid r <= a) return;
```

```
if (1 >= a \&\& r <= b \&\& (ts[v].*f)(args...)) return;
    int m = (1 + r)/2; push(v);
    update(2*v, 1, m, a, b, f, args...);
   update(2*v+1, m, r, a, b, f, args...);
   merge(v);
  \frac{1}{2} / \frac{1}{2} hash - 3 = 0.2f5 df
  template<class F, class... Args>
  void update(int a, int b, F f, Args&&... args) {
   update(1, 0, N, a, b, f, args...);
  template < class F, class... Args > int find_first (int v, int 1,
        int r, int a, int b, F f, Args&&... args) { // hash-4
    if (1 >= b \mid | r <= a \mid | !(ts[v].*f)(args...)) return -1;
   if (1 + 1 == r) return 1;
    int m = (1 + r)/2; push(v);
    int cur = find_first(2*v, 1, m, a, b, f, args...);
    if (cur == -1)
     cur = find_first(2*v+1, m, r, a, b, f, args...);
    return cur;
  \frac{1}{100} / \frac{1}{100} hash - \frac{1}{100} = 68aa30
  template<class F, class... Args>
  int find_first(int a, int b, F f, Args&&... args) {
    return find_first(1, 0, N, a, b, f, args...);
};
```

lazy-context.h

Description: Examples of Segment Tree with Lazy update bd0d51, 172 lines

```
template<typename T = int64 t> struct seg node { // hash-1
 T val, lz add, lz set;
  int sz; bool to_set;
  seg_node(T n = 0) : val(n), lz_add(0), lz_set(0), sz(1),
      to set(0) {}
  void push(seg node& l, seg node& r) {
   if (to set) {
     l.assign(lz set), r.assign(lz set);
     lz set = 0; to set = false;
   if (lz_add != 0) {
     1.add(lz\_add), r.add(lz\_add), lz\_add = 0;
  void merge(const seg_node& 1, const seg_node& r) {
   sz = 1.sz + r.sz; val = 1.val + r.val;
  bool add(T v) { // update \ range \ a[i] <- \ a[i] + v
   val += v * sz; lz add += v; return true;
  bool assign(T v) { // update \ range \ a[i] <- v
   val = v * sz; lz add = 0;
   lz_set = v; to_set = true; return true;
 T get_sum() const { return val; } // sum a[l, r)
\}; // hash-1 = 42f915
// update range a[i] \leftarrow a[i] + b * (i - s) + c
// assuming b and c are non zero, be careful
// get sum a[l, r]
template<typename T = int64 t > struct seg node { // <math>hash-2
 T sum, lzB, lzC;
  int sz, idx;
  seg\_node(int id = 0, T v = 0, int s = 0, T b = 0, T c = 0):
   sum(v), lzB(b), lzC(c - s * b), idx(id), sz(1) {}
  void push(seg node& 1, seg node& r) {
   1.add(lzB, lzC), r.add(lzB, lzC);
   lzB = lzC = 0;
  void merge(const seg_node& 1, const seg_node& r) {
   idx = min(1.idx, r.idx), sz = 1.sz + r.sz;
```

```
sum = 1.sum + r.sum;
    T sum idx(T n) const { return n * (n + 1) / 2; }
    bool add(T b, T c) {
            sum += b * (sum_idx(idx + sz) - sum_idx(idx)) + sz * c;
           lzB += b, lzC += c; return true;
    T get_sum() const { return sum; }
f(x) = \frac{1}{2} \int_{-\infty}^{\infty} \frac{1}
// update range a[i] \leftarrow b * a[i] + c
// get sum a/l, r)
struct seg_node { // hash-3
     int sz; i64 sum, lzB, lzC;
     seg node() : sz(1), sum(0), lzB(1), lzC(0) {}
     seg_node(i64 \ v) : sz(1), sum(v), lzB(1), lzC(0) {}
     void push(seg_node& 1, seg_node& r) {
           1.add(lzB, lzC), r.add(lzB, lzC);
            1zB = 1, 1zC = 0;
     void merge(const seg_node& 1, const seg_node& r) {
            sz = 1.sz + r.sz, sum = 1.sum + r.sum;
    bool add(i64 b, i64 c) {
            sum = (b * sum + c * sz), lzB = (lzB * b);
            lzC = (lzC * b + c); return true;
    i64 get_sum() const { return sum; }
\frac{1}{3}; \frac{1}{3} hash-3 = 3fd6ec
 // update range a[i] \leftarrow min(a[i], b);
 // update range a[i] \leftarrow max(a[i], b);
// get val a[i]
struct seq_node { // hash-4
    int mn, mx;
     int 1z0, 1z1;
     seg node(): mn(INT MAX), mx(INT MIN), lz0(INT MAX), lz1(
     void push(seg_node& 1, seg_node& r) {
          1.minimize(lz0), 1.maximize(lz1);
            r.minimize(lz0), r.maximize(lz1);
            lz0 = INT MAX, lz1 = INT MIN;
     void merge(const seg node& 1, const seg node& r) {
            mn = min(1.mn, r.mn), mx = max(1.mx, r.mx);
    bool minimize(int val) {
            mn = 1z0 = min(1z0, val);
            mx = 1z1 = min(1z0, 1z1); return true;
     bool maximize(int val) {
            mx = lz1 = max(lz1, val);
            mn = 1z0 = max(1z0, 1z1); return true;
    pair<int, int> get() const { return {mx, mn}; }
h: // hash-4 = a6c9e9
template<typename T> struct lazy_t { // hash-5
   T a, b, c;
     lazy_t() : a(0), b(-INF), c(+INF) {}
     lazy_t(T a, T b, T c) : a(a), b(b), c(c) {}
     void add(T val) {
           a += val, b += val, c += val;
     void upd min(T val) {
           if (b > val) b = val;
            if (c > val) c = val;
     void upd_max(T val) {
           if (b < val) b = val;
            if (c < val) c = val;</pre>
```

```
f(x) = \frac{1}{2} \int \frac{1}{2} (x^2 + y^2)^2 dx
template<typename T = int64 t> struct seg node { // hash-6
   T mi, mi2, ma, ma2, sum;
    T cnt_mi, cnt_ma, sz;
    lazv t<T> lz;
    seg node() : mi(INF), mi2(INF), ma(-INF), ma2(-INF), sum(0),
                 cnt_mi(0), cnt_ma(0), sz(0), lz() {}
    seg_node(T n) : mi(n), mi2(INF), ma(n), ma2(-INF), sum(n),
                 cnt_mi(1), cnt_ma(1), sz(1), lz() {}
    void push(seq_node& 1, seg_node& r) {
         if (!l.can_apply(lz) || !r.can_apply(lz)) return;
         lz = lazy_t < T > ();
    bool can_apply(const lazy_t<T>& f) {
         if (!add(f.a) || !upd_max(f.b) || !upd_min(f.c)) return
                      false:
         return true;
    \frac{1}{100} / \frac{1}{100} hash-6 = \frac{1}{100} hash-6 =
    void merge(const seg_node& 1, const seg_node& r) { // hash-7
         mi = min(l.mi, r.mi);
         mi2 = min((1.mi == mi) ? 1.mi2 : 1.mi, (r.mi == mi) ? r.mi2
                        : r.mi):
         cnt_mi = ((1.mi == mi) ? 1.cnt_mi : 0) + ((r.mi == mi) ? r.
                     cnt_mi : 0);
         ma = max(1.ma, r.ma);
         ma2 = max((1.ma == ma) ? 1.ma2 : 1.ma, (r.ma == ma) ? r.ma2
         cnt_ma = ((1.ma == ma) ? 1.cnt_ma : 0) + ((r.ma == ma) ? r.
                     cnt_ma : 0);
         sum = 1.sum + r.sum;
          sz = 1.sz + r.sz;
    h // hash - 7 = 936019
    bool add (T v) { // a_i = a_i + v // hash-8
         if (v) {
              mi += v;
              if (mi2 < INF) mi2 += v;
              if (ma2 > -INF) ma2 += v;
              sum += sz * v;
              lz.add(v);
         return true;
    \frac{1}{100} / \frac{1}{100} hash - 8 = 83626c
    bool upd_max(T v) { // a_i = max(a_i, v) // hash-9
         if (v > -INF) {
              if (v >= mi2) return false;
              else if (v > mi) {
                  if (ma == mi) ma = v;
                   if (ma2 == mi) ma2 = v;
                   sum += cnt_mi * (v - mi);
                   mi = v;
                   lz.upd max(v);
         return true:
    h // hash-9 = 877a43
    bool upd_min(T v) { // a_i = min(a_i, v) // hash-10
         if (v < INF) {
              if (v <= ma2) return false;
              else if (v < ma) {
                  if (ma == mi) mi = v;
                  if (mi2 == ma) mi2 = v;
                   sum -= cnt_ma * (ma - v);
                   ma = v;
                   lz.upd_min(v);
         return true;
```

3

```
} // hash-10 = 514d75 T get_sum() const { return sum; } // sum\ a[l,\ r);
```

sparse-segtree.h

Description: Sparse Segment Tree with point update. Doesnt allocate storage for nodes with no data. Use BumpAllocator for better performance! lines

```
const int SZ = 1 << 19;
template<class T> struct node_t {
 T delta = 0; node_t < T > * c[2];
  node_t() \{ c[0] = c[1] = nullptr; \}
  void upd(int pos, T v, int L = 0, int R = SZ-1) { // add \ v \ //
    if (L == pos && R == pos) { delta += v; return; }
    int M = (L + R) >> 1;
    if (pos <= M) {
      if (!c[0]) c[0] = new node_t();
      c[0]->upd(pos, v, L, M);
    } else {
      if (!c[1]) c[1] = new node_t();
      c[1]->upd(pos, v, M+1, R);
    delta = 0;
    for (int i = 0; i < 2; ++i) if (c[i]) delta += c[i]->delta;
  \frac{1}{2} / \frac{1}{2} hash - 1 = 8c7b01
  T query (int lx, int rx, int L = 0, int R = SZ-1) { // query
       sum of segment // hash-2
    if (rx < L || R < lx) return 0;
    if (lx <= L && R <= rx) return delta;
    int M = (L + R) >> 1; T res = 0;
    if (c[0]) res += c[0]->query(lx, rx, L, M);
    if (c[1]) res += c[1]->query(lx, rx, M+1, R);
    return res;
  \frac{1}{hash-2} = 6aa202
  void upd(int pos, node_t *a, node_t *b, int L = 0, int R = SZ
       -1) { // hash-3
    if (L != R) {
      int M = (L + R) >> 1;
      if (pos <= M) {
        if (!c[0]) c[0] = new node_t();
        c[0] \rightarrow upd(pos, a ? a \rightarrow c[0] : nullptr, b ? b \rightarrow c[0] :
              nullptr, L, M);
        if (!c[1]) c[1] = new node_t();
        c[1] \rightarrow upd(pos, a ? a \rightarrow c[1] : nullptr, b ? b \rightarrow c[1] :
              nullptr, M+1, R);
    delta = (a ? a -> delta : 0) + (b ? b -> delta : 0);
  \frac{1}{100} / \frac{1}{100} hash - 3 = 514618
```

segtree-2d.h

Description: 2D Segment Tree.

Time: $\mathcal{O}(N \log^2 N)$ of memory, $\mathcal{O}(\log^2 N)$ per query

persistent-segtree.h

Description: Sparse (N can be up to 1e18) persistent segment tree. adde48. 43 lines

```
template<typename T> struct seg_tree {
T idnt = 0; // identity value
T f(T 1, T r) { return 1 + r; }
 struct node {
   int 1 = 0, r = 0;
   T x;
   node(T _x) : x(_x) {}
 int N: vector<node> t:
 seg_tree(int _N) : N(_N) { t.push_back(node(idnt)); }
 int cpv(int v) {
   t.push_back(t[v]);
   return int(t.size()) - 1;
 int upd(int v, int p, T x, int a = 0, int b = -1) { // hash-1
   b = \sim b ? b : N - 1;
   int u = cpy(v);
   if (a == b) {
     t[u].x += x;
     return u:
   int m = (a + b) / 2;
   if (p \le m) t[u].l = upd(t[v].l, p, x, a, m);
   else t[u].r = upd(t[v].r, p, x, m+1, b);
   t[u].x = f(t[t[u].1].x, t[t[u].r].x);
    return u;
  \frac{1}{100} / \frac{1}{100} hash - 1 = 9c27d1
 T get(int v, int 1, int r, int a = 0, int b = -1) { // hash-2
   b = \sim b ? b : N - 1;
   if (!v || 1 > b || r < a) return idnt;
   if (a >= 1 && b <= r) return t[v].x;
   int m = (a + b) / 2;
   return f(get(t[v].1, 1, r, a, m), get(t[v].r, 1, r, m+1, b));
 \frac{1}{100} / \frac{1}{100} hash - 2 = 7d1e05
 T get_kth(int 1, int r, int k, int a = 0, int b = -1) { //
      hash-3
   b = \sim b ? b : N - 1;
   if (a == b) return a;
   int cnt = t[t[r].1].x - t[t[1].1].x;
   int m = (a + b) / 2;
   if (k <= cnt) return get_kth(t[1].1, t[r].1, k, a, m);</pre>
    return get_kth(t[1].r, t[r].r, k-cnt, m+1, b);
 \frac{1}{100} / \frac{1}{100} hash - 3 = 732fd0
};
```

rmq.h

Description: Range Minimum/Maximum Queries on an array. Returns $\min(V[a], V[a+1], ..., V[b])$ in constant time. Returns a pair that holds the answer, first element is the value and the second is the index.

```
// values is a vector of pairs {val(i), index(i)}
rmq.query(inclusive, exclusive);
rmq_t<pair<int, int>, greater<pair<int, int>>> rmq(values)
//max query
Time: O(|V| \log |V| + Q)
                                                      8c53c5, 19 lines
template<typename T, typename Cmp=less<T>>
struct rmq_t : private Cmp {
  int N = 0;
  vector<vector<T>> table;
  const T& min(const T& a, const T& b) const { return Cmp::
       operator()(a, b) ? a : b; }
  rmq_t() {}
  rmg t(const vector<T>& values) : N(int(values.size())), table
       (__1q(N) + 1) {
    table[0] = values;
    for (int a = 1; a < int(table.size()); ++a) {</pre>
      table[a].resize(N - (1 \ll a) + 1);
      for (int b = 0; b + (1 << a) <= N; ++b)
        table[a][b] = min(table[a-1][b], table[a-1][b+(1<<(a-1)
            ) ] ) ;
 T query(int a, int b) const {
    int lg = __lg(b - a);
    return min(table[lq][a], table[lq][b - (1 << lq) ]);</pre>
};
```

Usage: rmq_t<pair<int, int>> rmq(values);

fenwick-tree.h

Description: Computes partial sums a[0] + a[1] + ... + a[pos - 1], and updates single elements a[i], taking the difference between the old and new value.

Time: Both operations are $\mathcal{O}(\log N)$.

2ee6d4, 26 lines

```
template<typename T> struct FT {
 vector<T> s;
 FT(int n) : s(n) {}
 FT(const vector<T>& A) : s(A) {
   const int N = int(s.size());
   for (int a = 0; a < N; ++a)
     if ((a | (a + 1)) < N) s[a | (a + 1)] += s[a];
 void update(int pos, T dif) { // a[pos] += dif
   for (; pos < (int)s.size(); pos |= pos + 1) s[pos] += dif;
 T query(int pos) { // sum of values in [0, pos)
   T res = 0;
   for (; pos > 0; pos &= pos -1) res += s[pos-1];
   return res:
 // min pos st sum of [0, pos] >= sum. Returns n if no sum
 int lower_bound(T sum) { //is >= sum, or -1 if empty sum is.
   if (sum \le 0) return -1;
   int pos = 0;
   for (int pw = 1 << 25; pw; pw >>= 1)
     if (pos + pw \le (int)s.size() \&\& s[pos + pw-1] < sum)
       pos += pw, sum -= s[pos-1];
   return pos;
};
```

fenwick-tree-2d.h

Description: Computes sums a[i,j] for all i < I, j < J, and increases single elements a[i,j]. Requires that the elements to be updated are known in advance (call fakeUpdate() before init()).

Time: $\mathcal{O}\left(\log^2 N\right)$. (Use persistent segment trees for $\mathcal{O}\left(\log N\right)$.)

"fenwick-tree.h" aebbdc, 25 lines

mo line-container matrix range-color implicit-treap

```
template<typename T> struct FT2 {
  vector<vector<int>> ys; vector<FT<T>> ft;
  FT2(int limx) : vs(limx) {}
  void fakeUpdate(int x, int y) {
   for (; x < (int)ys.size(); x |= x + 1) ys[x].push_back(y);
  void init() {
    for(auto &v : ys) {
     sort(v.begin(), v.end());
     v.resize(unique(v.begin(), v.end()) - v.begin());
      ft.emplace_back(v.size());
  int ind(int x, int y) {
    return (int) (lower_bound(ys[x].begin(), ys[x].end(), y) -
        ys[x].begin()); }
  void update(int x, int y, T dif) {
    for (; x < ys.size(); x |= x + 1)
      ft[x].update(ind(x, y), dif);
  T query(int x, int y) {
   T sum = 0;
    for (; x; x \&= x - 1) sum += ft[x-1].query(ind(x-1, y));
    return sum;
};
```

mo.h

Description: Answer interval or tree path queries by finding an approximate TSP through the queries, and moving from one query to the next by adding/removing points at the ends. If values are on tree edges, change step to add/remove the edge (a, c) and remove the initial add call (but keep in).

```
Time: \mathcal{O}(N\sqrt{Q})
                                                       5ef29d, 49 lines
void add(int ind, int end) { ... } // add a[ind] (end = 0 or 1)
void del(int ind, int end) { ... } // remove a[ind]
int calc() { ... } // compute current answer
vector<int> mo(vector<pair<int, int>> 0) { // hash-1
 int L = 0, R = 0, blk = 350; // \sim N/sqrt(Q)
  vector<int> s(int(Q.size())), res = s;
#define K(x) pair<int, int>(x.first/blk, x.second ^ -(x.first/
    blk & 1))
  iota(s.begin(), s.end(), 0);
  sort(s.begin(), s.end(), [\&](int s, int t){ return K(Q[s]) < }
       K(Q[t]); });
  for (int qi : s) {
    auto q = Q[qi];
   while (L > q.first) add(--L, 0);
    while (R < q.second) add(R++, 1);
    while (L < q.first) del(L++, 0);
    while (R > q.second) del(--R, 1);
   res[qi] = calc();
  return res;
\frac{1}{2} / \frac{1}{2} hash - 1 = d9247c
vector<int> moTree(vector<array<int, 2>> Q, vector<vector<int
    >>& ed, int root=0){ // hash-2
  int N = int(ed.size()), pos[2] = {}, blk = 350; // \sim N/sqrt(Q)
  vector < int > s(int(Q.size())), res = s, I(N), L(N), R(N), in(N)
       ), par(N);
  add(0, 0), in[0] = 1;
  auto dfs = [\&] (int x, int p, int dep, auto& f) -> void {
   par[x] = p;
   L[x] = N;
    if (dep) I[x] = N++;
    for (int y : ed[x]) if (y != p) f(y, x, !dep, f);
   if (!dep) I[x] = N++;
```

```
R[x] = N;
 };
 dfs(root, -1, 0, dfs);
#define K(x) pii(I[x[0]] / blk, I[x[1]] ^ -(I[x[0]] / blk & 1))
 iota(s.begin(), s.end(), 0);
 sort(s.begin(), s.end(), [&](int s, int t){ return K(Q[s]) <</pre>
      K(Q[t]); });
 for (int qi : s) for (int end = 0; end < 2; ++end) {</pre>
   int &a = pos[end], b = Q[qi][end], i = 0;
#define step(c) { if (in[c]) { del(a, end); in[a] = 0; } \
 else { add(c, end); in[c] = 1; } a = c; }
    while (!(L[b] \le L[a] \&\& R[a] \le R[b]))
     I[i++] = b, b = par[b];
   while (a != b) step(par[a]);
   while (i--) step(I[i]);
    if (end) res[qi] = calc();
 return res;
\frac{1}{hash-2} = bbf891
```

line-container.h

Description: Container where you can add lines of the form kx+m, and query maximum values at points x. Useful for dynamic programming ("convex hull trick").

```
Time: \mathcal{O}(\log N)
                                                         cd3f16, 27 lines
struct Line { // hash-1
 mutable ll k, m, p;
 bool operator<(const Line& o) const { return k < o.k; }</pre>
 bool operator<(ll x) const { return p < x; }</pre>
1; // hash-1 = 7e3ecf
struct LineContainer : multiset<Line, less<>>
 static const 11 inf = LLONG_MAX; //for doubles 1/.0
 ll div(ll a, ll b) { //for\ doubles\ a/b
    return a / b - ((a ^ b) < 0 && a % b); }
 bool isect(iterator x, iterator y) { // hash-2
   if (y == end()) { x->p = inf; return false; }
    if (x->k == y->k) x->p = x->m > y->m ? inf : -inf;
    else x->p = div(y->m - x->m, x->k - y->k);
    return x->p >= y->p;
  h // hash-2 = ea7809
 void add(ll k, ll m) { // hash-3
    auto z = insert(\{k, m, 0\}), y = z++, x = y;
    while (isect(y, z)) z = erase(z);
    if (x != begin() \&\& isect(--x, y)) isect(x, y = erase(y));
    while ((y = x) != begin() \&\& (--x)->p >= y->p)
      isect(x, erase(v));
 \frac{1}{1} / \frac{1}{1} hash - 3 = 0.8625 f
 11 query(11 x) { // hash-4
   assert(!empty()); auto 1 = *lower_bound(x);
   return 1.k * x + 1.m;
 \frac{1}{2} / \frac{1}{2} hash - \frac{1}{2} = d21e2f
};
```

matrix.h

Description: Basic operations on square matrices. Usage: Matrix<int> A(N, vector<int>(N));

447637, 28 lines

```
template <typename T> struct Matrix : vector<vector<T>> {
 using vector<vector<T>>::vector;
 using vector<vector<T>>::size;
 int h() const { return int(size()); }
 int w() const { return int((*this)[0].size()); }
 Matrix operator*(const Matrix& r) const {
   assert (w() == r.h()); Matrix res(h(), vector < T > (r.w()));
   for(int i = 0; i < h(); ++i) for(int j = 0; j < r.w(); ++j)
     for (int k = 0; k < w(); ++k)
       res[i][j] += (*this)[i][k] * r[k][j];
    return res;
```

```
friend auto operator*(const Matrix<T>& A.const vector<T>& b){
    int N = int(A.size()), M = int(A[0].size());
    vector<T> y(N);
    for (int i = 0; i < N; ++i)
      for (int j = 0; j < M; ++j) y[i] += A[i][j] * b[j];
  Matrix& operator*=(const Matrix& r) {return *this= *this * r;}
 Matrix pow(ll n) const {
    assert (h() == w()); assert (n >= 0);
    Matrix x = *this, r(h(), vector<T>(w()));
    for (int i = 0; i < h(); ++i) r[i][i] = T(1);
    while (n) { if (n & 1) r \star= x; x \star= x; n >>= 1; }
    return r;
};
```

5

range-color.h

Description: RangeColor structure, supports point queries and range updates, if C isn't int32_t change freq to map

```
Time: \mathcal{O}(\lg(L) * Q)
template<class T, class C> struct RangeColor { // hash{-}1
 struct Node{
    T lo, hi; C color;
    bool operator<(const Node &n) const { return hi < n.hi; }</pre>
 C minInf; set<Node> st; vector<T> freq;
  RangeColor(T first, T last, C maxColor, C iniColor = C(0)):
       minInf(first - T(1)), freq(maxColor + 1) {
    freq[iniColor] = last - first + T(1);
    st.insert({first, last, iniColor});
  \frac{1}{100} / \frac{1}{100} hash-1 = b9833d
  C query(T i) { //get color in position i
    return st.upper bound({T(0), i - T(1), minInf})->color;
  void upd (T a, T b, C x) { //set x in [a, b] // hash=2
    auto p = st.upper_bound({T(0), a - T(1), minInf});
    assert(p != st.end());
    T lo = p->lo, hi = p->hi; C old = p->color;
    freq[old] \rightarrow (hi - lo + T(1)); p = st.erase(p);
    if (lo < a)
      freq[old] += (a-lo), st.insert({lo, a-T(1), old});
    if (b < hi)
      freq[old] += (hi-b), st.insert({b+T(1), hi, old});
    while ((p != st.end()) && (p->lo <= b)) {
      lo = p->lo, hi = p->hi; old = p->color;
      freq[old] = (hi - lo + T(1));
      if (b < hi) {</pre>
        freq[old] += (hi - b); st.erase(p);
        st.insert({b + T(1), hi, old});
        break;
      } else p = st.erase(p);
    freq[x] += (b - a + T(1)); st.insert({a, b, x});
  \frac{1}{100} / \frac{1}{100} hash - 2 = 7575b8
 T countColor(C x) { return freq[x]; }
};
```

implicit-treap.h

Description: A short self-balancing tree. It acts as a sequential container with log-time splits/joins, and is easy to augment with additional data. Time: $\mathcal{O}(\log N)$

```
8c89db, 76 lines
struct node { // hash-1
  int val, p, sz; bool rev;
  array<node*, 2> c{nullptr, nullptr};
 node(int k) : val(k), p(rng()), sz(0), rev(false) {}
```

```
~node() {
    delete c[0];
    delete c[1];
\}; // hash-1 = 0055b5
inline int sz(node *t) { // hash-2
 return (!t ? 0 : t->sz);
\frac{1}{hash-2} = 99838d
inline void push (node *t) { // hash-3
 if (!t) return;
  if (t->rev) {
    swap(t->c[0], t->c[1]);
    if (t->c[0]) t->c[0]->rev ^= t->rev;
    if (t->c[1]) t->c[1]->rev ^= t->rev;
    t->rev = 0;
\frac{1}{100} / \frac{1}{100} hash - 3 = 910227
inline void pull (node *t) { // hash-4
 if (!t) return;
  push(t); push(t->c[0]); push(t->c[1]);
  t->sz = sz(t->c[0]) + sz(t->c[1]) + 1;
\frac{1}{100} / \frac{1}{100} hash-4 = 85cde9
inline void split(node *t, node *&a, node *&b, int k) { //k on
     left
  push(t);
  if (!t) a = b = nullptr;
  else if (k \le sz(t->c[0])) {
    split(t->c[0], a, t->c[0], k);
    split(t->c[1], t->c[1], b, k-1-sz(t->c[0]));
 pull(t);
inline void merge (node *&t, node *a, node *b) { // hash-5
 push(a); push(b);
  if (!a) t = b;
  else if (!b) t = a;
  else if (a->p \le b->p) {
   merge(a - c[1], a - c[1], b);
   t = a;
  } else {
    merge(b->c[0], a, b->c[0]);
    t = b;
  pull(t);
\frac{1}{100} / \frac{1}{100} hash - 5 = 34473a
inline void add(node *\&t, node *a, int k) { // hash-6
  push(t);
  if (!t) t = a;
  else if (a->p>=t->p) {
    split(t, a->c[0], a->c[1], k);
   t = a;
  } else if (sz(t->c[0]) >= k) add(t->c[0], a, k);
  else add(t->c[1], a, k-1-sz(t->c[0]));
  pull(t);
\frac{1}{100} / \frac{1}{100} hash - 6 = 58c383
void del (node *&t, int k) { // hash-7
  push(t);
  if (!t) return;
  if (sz(t->c[0]) == k) merge(t, t->c[0], t->c[1]);
  else if (sz(t->c[0]) > k) del(t->c[0], k);
  else del(t->c[1], k);
  pull(t);
// hash-7 = a097c3
inline void dump_treap(node *t) { // hash-8
 if (!t) return;
  push(t);
```

```
dump_treap(t->c[0]);
cerr << t->val << ' ';
dump_treap(t->c[1]);
} // hash-8 = 8675f9
```

$\underline{\text{Numerical}} \ (4)$

poly-interpolate.h

Description: Given n points $(\mathbf{x}[\mathbf{i}], \mathbf{y}[\mathbf{i}])$, computes an n-1-degree polynomial p that passes through them: $p(x) = a[0] * x^0 + \ldots + a[n-1] * x^{n-1}$. For numerical precision, pick $x[k] = c * \cos(k/(n-1) * \pi), k = 0 \ldots n-1$. **Time:** $\mathcal{O}\left(n^2\right)$

```
typedef vector<double> vd;
vd interpolate(vd x, vd y, int n) {
  vd res(n), temp(n);
  for(int k = 0; k < n-1; ++k) for(int i = k+1; i < n; ++i)
    y[i] = (y[i] - y[k]) / (x[i] - x[k]);
  double last = 0; temp[0] = 1;
  for(int k = 0; k < n; ++k) for(int i = 0; i < n; ++i) {
    res[i] += y[k] * temp[i]; swap(last, temp[i]);
    temp[i] -= last * x[k];
  }
  return res;
}</pre>
```

lagrange.h

Description: Lagrange interpolation over a finite field and some combo stuff **Time:** O(N)

```
"../number-theory/modular-arithmetic.h", "../number-theory/preparator.h" ad3879, 13
```

```
template<typename T> struct interpolator_t {
  vector<T> S;
  interpolator_t (int N): S(N) {}
  T interpolate(const vector<T>& y, T x) { // hash-1
   int N = int(y.size()); int sgn = (N & 1 ? 1 : -1);
   T res = 0, P = 1; S[N - 1] = 1;
  for (int i = N-1; i > 0; --i) S[i-1] = S[i] * (x-i);
  for (int i = 0; i < N; ++i, sgn *= -1, P *= (x - i + 1)) {
    res += y[i] * sgn * P * S[i] * ifact[i] * ifact[N-1-i];
  }
  return res;
} // hash-1 = 2fb780
}</pre>
```

berlekamp-massey.h

Description: Recovers any n-order linear recurrence relation from the first 2n terms of the recurrence. Useful for guessing linear recurrences after brute-forcing the first terms. Should work on any field, but numerical stability for floats is not guaranteed. Output will have size $\leq n$.

```
Usage: BerlekampMassey({0, 1, 1, 3, 5, 11}) // {1, 2} Time: \mathcal{O}\left(N^2\right)
```

```
"../number-theory/modular-arithmetic.h"
                                                       66d78a, 17 lines
template <typename num>
vector<num> BerlekampMassey(const vector<num>& s) {
 int n = int(s.size()), L = 0, m = 0; num b = 1;
 vector < num > C(n), B(n), T; C[0] = B[0] = 1;
 for (int i = 0; i < n; i++) { ++m; // hash=1
   num d = s[i];
    for (int j = 1; j \le L; j++) d += C[j] * s[i - j];
    if (d == 0) continue;
    T = C; num coef = d / b;
    for (int j = m; j < n; j++) C[j] -= coef * B[j - m];
   if (2 * L > i) continue;
   L = i + 1 - L; B = T; b = d; m = 0;
 \frac{1}{2} // hash-1 = ebf5ec
 C.resize(L + 1); C.erase(C.begin());
```

```
for (auto& x : C) x = -x;
return C;
```

linear-recurrence.h

Description: Bostan-Mori algorithm. Generates the k'th term of an n-order linear recurrence $S[i] = \sum_j S[i-j-1]tr[j]$, given $S[0\dots n-1]$ and $tr[0\dots n-1]$. Faster than matrix multiplication. Useful together with Berlekamp–Massey.

```
Usage: linear_rec(\{0, 1\}, \{1, 1\}, k) // k'th Fibonacci number Time: \mathcal{O}(n \log n \log k)
```

```
"../number-theory/modular-arithmetic.h"
template<typename T>
T linear_rec(const vector<T>& S, const vector<T>& tr, ll K) {
 const int N = int(tr.size());
  vector<T> qs(N + 1); qs[0] = 1;
  for (int i = 0; i < N; ++i) qs[i + 1] = -tr[i];
  auto fs = fft.convolve(S, qs); fs.resize(N);
  for (; K; K /= 2) { // hash-1
    auto gneg = gs;
    for (int i = 1; i \le N; i += 2) qneq[i] = -qneq[i];
    fs = fft.convolve(fs, qneg), qs = fft.convolve(qs, qneg);
    for (int i = 0; i < N; ++i)
      fs[i] = fs[2 * i + (K & 1)], qs[i] = qs[2 * i];
    qs[N] = qs[2*N]; fs.resize(N), qs.resize(N+1);
  \frac{1}{100} / \frac{1}{100} = 641c09
 return fs[0]:
```

integrate.h

Description: Simple integration of a function over an interval using Simpson's rule. The error should be proportional to h^4 , although in practice you will want to verify that the result is stable to desired precision when epsilon changes.

7bb98e, 7 lines

```
template < class F >
double quad(double a, double b, F& f, const int n = 1000) {
  double h = (b - a) / 2 / n, v = f(a) + f(b);
  for (int i = 1; i < n*2; ++i)
    v += f(a + i*h) * (i&1 ? 4 : 2);
  return v * h / 3;
}</pre>
```

integrate-adaptive.h

Description: Fast integration using an adaptive Simpson's rule.

Usage: double sphereVolume = quad(-1, 1, [](double x) {
return quad(-1, 1, [&](double y) {

```
return quad(-1, 1, [&](double z) {
  return x*x + y*y + z*z < 1; });});

  typedef double d;
  #define S(a,b) (f(a) + 4*f((a+b) / 2) + f(b)) * (b-a) / 6
```

```
typeder double d;
#define S(a,b) (f(a) + 4*f((a+b) / 2) + f(b)) * (b-a) / 6
template <class F>
d rec(F& f, d a, d b, d eps, d S) {
  d c = (a + b) / 2, S1 = S(a, c), S2 = S(c, b), T = S1 + S2;
  if (abs(T - S) <= 15 * eps || b - a < 1e-10)
    return T + (T - S) / 15;
  return rec(f, a, c, eps / 2, S1) + rec(f, c, b, eps / 2, S2);
}
template < class F>
d quad(d a, d b, F f, d eps = 1e-8) {
  return rec(f, a, b, eps, S(a, b));
}
```

gaussian-elimination.h

Time: $\mathcal{O}(\min(N, M)NM)$

"../data-structures/matrix.h" 059077, 61 lines

template<typename T> struct gaussian_elimination {

```
int N, M; Matrix<T> A, E;
vector<int> pivot; int rank, nullity, sgn;
gaussian_elimination(const Matrix<T>& A_) : A(A_) { // hash-1
 N = A.size(), M = A[0].size(), E=Matrix<T>(N, vector<T>(N));
 for (int i = 0; i < N; ++i) E[i][i] = 1;
 rank = 0, nullity = M, sgn = 0; pivot.assign(M, -1);
  for (int col = 0, row = 0; col < M && row < N; ++col) {
   int sel = -1;
   for (int i = row; i < N; ++i) if (A[i][col] != 0) {
     sel = i; break;
   if (sel == -1) continue;
   if (sel != row) {
     sqn += 1;
      swap(A[sel], A[row]); swap(E[sel], E[row]);
    for (int i = 0; i < N; ++i) {
     if (i == row) continue;
     T c = A[i][col] / A[row][col];
      for (int j = col; j < M; ++j)
       A[i][j] = c*A[row][j];
      for (int j = 0; j < N; ++j)
        E[i][j] -= c*E[row][j];
   pivot[col] = row++; ++rank, --nullity;
\frac{1}{2} / \frac{1}{2} hash - 1 = d52725
auto solve (vector<T> b, bool reduced=false) const { // hash-2
 if (reduced == false) b = E * b;
 vector<T> x(M);
  for (int j = 0; j < M; ++j) {
   if (pivot[j] == -1) continue;
   x[j] = b[pivot[j]] / A[pivot[j]][j];
   b[pivot[j]] = 0;
  for (int i = 0; i < N; ++i)
   if (b[i] != 0) return make_pair(false, x);
  return make_pair(true, x);
h // hash - 2 = ed96b5
auto kernel_basis() const { // hash-3
 vector<vector<T>> basis; vector<T> e(M);
  for (int j = 0; j < M; ++j) {
   if (pivot[j] != -1) continue;
   e[j] = 1; auto v = solve(A * e, true).second;
   e[j] = 0, y[j] = -1; basis.push_back(y);
 return basis;
\frac{1}{hash-3} = 126a4f
auto inverse() const { // hash-4
 assert (N == M); assert (rank == N);
 Matrix<T> res(N, vector<T>(N));
 vector<T> e(N);
  for (int i = 0; i < N; ++i) {
   e[i] = 1; auto x = solve(e).second;
   for (int j = 0; j < N; ++j) res[j][i] = x[j];
   e[i] = 0;
 return res;
\frac{1}{2} / \frac{1}{2} hash - \frac{1}{2} = a87fb3
```

linear-solver-z2.h

Description: Solves Ax = b over \mathbb{F}_2 . If there are multiple solutions, one is returned arbitrarily. Returns true, or false if no solutions. Last column of a is b. c is the rank.

Time: $\mathcal{O}\left(n^2m\right)$

7a24e1, 24 lines

```
typedef bitset<2010> bs;
bool gauss(vector<br/>bs> a, bs& ans, int n) {
```

```
int m = int(a.size()), c = 0;
bs pos; pos.set();
for (int j = n-1, i; j >= 0; --j) {
  for (i = c; i < m; ++i)</pre>
    if (a[i][j]) break;
  if (i == m) continue;
  swap(a[c], a[i]);
  i = c++; pos[j] = 0;
  for (int k = 0; k < m; ++k)
    if (a[k][j] && k != i) a[k] ^= a[i];
for (int i = 0; i < m; ++i) {
  int ac = 0;
  for (int j = 0; j < n; ++j) {
    if (!a[i][j]) continue;
    if (!pos[j]) pos[j] = 1, ans[j] = ac^a[i][n];
    ac ^= ans[j];
  if (ac != a[i][n]) return false;
return true;
```

simplex.h

Description: Solves a general linear maximization problem: maximize $c^T x$ subject to Ax < b, x > 0.

Time: $\mathcal{O}(NM * \#pivots)$, where a pivot may be e.g. an edge relaxation. $\mathcal{O}(2^n)$ in the general case. WARNING- segfaults on empty (size 0) max cx st Ax \leq =b, x>=0 do 2 phases; 1st check feasibility; 2nd check boundedness and one

83fec6, 39 lines using dbl = double; using vd = vector<dbl>; // hash-1 vd simplex(vector<vd> A, vd b, vd c) { const dbl E = 1e-9; int n = A.size(), m = A[0].size() + 1, r = n, s = m-1; auto D = vector<vd>(n+2, vd(m+1)); vector<int> ix = vector<int>(n + m); for (int i = 0; i < n + m; ++i) ix[i] = i; for (int i = 0; i < n; ++i) { for (int j = 0; j < m-1; ++j) D[i][j] = -A[i][j]; D[i][m-1] = 1; D[i][m] = b[i];if (D[r][m] > D[i][m]) r = i; $\frac{1}{100} / \frac{1}{100} hash-1 = 0a7467$ for (int j = 0; j < m-1; ++j) D[n][j] = c[j]; D[n + 1][m - 1] = -1; int z = 0;for (dbl d;;) { // hash-2 if $(r < n) \{ swap(ix[s], ix[r + m]);$ D[r][s] = 1.0/D[r][s];for (int j = 0; $j \le m$; ++j) if (j != s) D[r][j] *= -D[r][s];for (int i = 0; $i \le n+1$; ++i) if (i != r) { for (int j = 0; $j \le m$; ++ j) if (j != s) D[i][j] += D[r][j] * D[i][s]; $D[i][s] \star= D[r][s];$ r = -1; s = -1;for (int j = 0; j < m; ++j) if (s < 0 || ix[s] > ix[j]) if $(D[n+1][j]>E \mid \mid D[n+1][j]>-E \&\& D[n][j]>E) s = j;$ if (s < 0) break; for (int i = 0; i < n; ++i) if (D[i][s] < -E) { $if (r<0 \mid | (d = D[r][m]/D[r][s]-D[i][m]/D[i][s]) < -E$ | | d < E && ix[r+m] > ix[i+m]) r = i;if (r < 0) return vd(); // unbounded $\frac{1}{2} / \frac{1}{2} hash - 2 = dd3d9c$ if (D[n+1][m] < -E) return vd(); // infeasible for (int i=m; i < n+m; ++i) if (ix[i] < m-1) x[ix[i]] = D[i-m][m]; dbl result = D[n][m]; return x; // ans: D[n][m]

tridiagonal.h

Description: x = tridiagonal(d, p, q, b) solves the equation system

$$\begin{pmatrix} b_0 \\ b_1 \\ b_2 \\ b_3 \\ \vdots \\ b_{n-1} \end{pmatrix} = \begin{pmatrix} d_0 & p_0 & 0 & 0 & \cdots & 0 \\ q_0 & d_1 & p_1 & 0 & \cdots & 0 \\ 0 & q_1 & d_2 & p_2 & \cdots & 0 \\ \vdots & \vdots & \ddots & \ddots & \vdots & \vdots \\ 0 & 0 & \cdots & q_{n-3} & d_{n-2} & p_{n-2} \\ 0 & 0 & \cdots & 0 & q_{n-2} & d_{n-1} \end{pmatrix} \begin{pmatrix} x_0 \\ x_1 \\ x_2 \\ x_3 \\ \vdots \\ x_{n-1} \end{pmatrix}$$

This is useful for solving problems on the type

$$a_i = b_i a_{i-1} + c_i a_{i+1} + d_i, \ 1 \le i \le n,$$

where a_0, a_{n+1}, b_i, c_i and d_i are known. a can then be obtained from

$$\{a_i\} = \text{tridiagonal}(\{1, -1, -1, \dots, -1, 1\}, \{0, c_1, c_2, \dots, c_n\}, \{b_1, b_2, \dots, b_n, 0\}, \{a_0, d_1, d_2, \dots, d_n, a_{n+1}\}).$$

Fails if the solution is not unique.

If $|d_i| > |p_i| + |q_{i-1}|$ for all i, or $|d_i| > |p_{i-1}| + |q_i|$, or the matrix is positive definite, the algorithm is numerically stable and neither tr nor the check for diag[i] == 0 is needed.

Time: $\mathcal{O}(N)$

be9642, 23 lines

```
typedef double T:
vector<T> tridiagonal(vector<T> diag, const vector<T> &super,
    const vector<T> &sub, vector<T> b) {
  int n = b.size(); vector<int> tr(n);
  for (int i = 0; i < n-1; ++i)
    if (abs(diag[i]) < 1e-9 * abs(super[i])) { // diag[i] == 0}
     b[i+1] -= b[i] * diag[i+1] / super[i];
      if (i+2 < n) b[i+2] = b[i] * sub[i+1] / super[i];
      diag[i+1] = sub[i]; tr[++i] = 1;
      diag[i+1] -= super[i]*sub[i]/diag[i];
      b[i+1] -= b[i] * sub[i] / diag[i];
  for (int i = n; i--;)
    if (tr[i]) {
      swap(b[i], b[i-1]); diag[i-1] = diag[i];
      b[i] /= super[i-1];
    } else {
      b[i] /= diag[i];
      if (i) b[i-1] -= b[i]*super[i-1];
 return b;
```

4.1 Fourier transforms

fast-fourier-transform.h

Description: For convolution of complex numbers or more than two vectors: FFT, multiply pointwise, FFT inverse back.

Time: $O(N \log N)$ with $N = |A| + |B| \ (\sim 1s \text{ for } N = 2^{22})$

```
".../number-theory/modular-arithmetic.h"

template <typename dbl> struct cplx { // hash-1
    dbl x, y; using P = cplx;
    cplx(dbl x_ = 0, dbl y_ = 0) : x(x_), y(y_) { }
    friend P operator+(P a, P b) { return P(a.x+b.x, a.y+b.y); }
    friend P operator-(P a, P b) { return P(a.x-b.x, a.y-b.y); }
    friend P operator*(P a, P b) { return P(a.x-b.x, a.y-b.y); }
    friend P conj(P a) { return P(a.x, -a.y); }
    friend P conj(P a) { return P(a.x, -a.y); }
    friend P inv(P a) { dbl n = (a.x*a.x+a.y*a.y); return P(a.x/n ,-a.y/n); }
};

template <typename dbl> struct root_of_unity<cplx<dbl>> {
    static cplx<dbl> f(int k) {
```

```
static const dbl PI = acos(-1); dbl a = 2*PI/k;
    return cplx<dbl>(cos(a), sin(a));
f(x) = 84c651
inline int nxt_pow2 (int s) { return 1 << (s > 1 ? 32 -
    __builtin_clz(s-1) : 0); }
template <typename T> struct root_of_unity {};
//(MOD,3) := (M1:897581057), (M3:985661441), (M5:935329793)
using M0 = modnum<998244353U>; // hash-2
constexpr unsigned primitive_root(unsigned M) {
 if (M == 880803841U) return 26U; // (M2)
  else if (M == 943718401U) return 7U; // (M4)
  else if (M == 918552577U) return 5U; // (M6)
 else return 3U;
template<unsigned MOD> struct root_of_unity<modnum<MOD>> {
  static constexpr modnum<MOD> g0 = primitive_root(MOD);
  static modnum<MOD> f(int K) {
    assert ((MOD-1) %K == 0); return q0.pow((MOD-1)/K);
\}; // hash-2 = de8785
template<typename T> struct FFT {
 vector<T> rt; vector<int> rev;
  FFT(): rt(2, T(1)) {}
 void init(int N) { // hash-3
   N = nxt_pow2(N);
   if (N > int(rt.size())) {
     rev.resize(N); rt.reserve(N);
     for (int a = 0; a < N; ++a)
        rev[a] = (rev[a/2] | ((a&1)*N)) >> 1;
      for (int k = int(rt.size()); k < N; k *= 2) {
        rt.resize(2*k);
       T z = root_of_unity < T > :: f(2 * k);
        for (int a = k/2; a < k; ++a)
          rt[2*a] = rt[a], rt[2*a+1] = rt[a] * z;
  \frac{1}{2} / \frac{1}{2} hash - 3 = fcd279
  void fft (vector<T>& xs, bool inverse) const { // hash-4
   int N = int(xs.size());
   int s = __builtin_ctz(int(rev.size())/N);
   if (inverse) reverse(xs.begin() + 1, xs.end());
    for (int a = 0; a < N; ++a) {
     if (a < (rev[a] >> s)) swap(xs[a], xs[rev[a] >> s]);
    for (int k = 1; k < N; k *= 2) {
     for (int a = 0; a < N; a += 2*k) {
       int u = a, v = u + k;
        for (int b = 0; b < k; ++b, ++u, ++v) {
         T z = rt[b + k] * xs[v];
          xs[v] = xs[u] - z, xs[u] = xs[u] + z;
    if (inverse)
     for (int a = 0; a < N; ++a) xs[a] = xs[a] * inv(T(N));
  \frac{1}{1} / \frac{1}{1} hash - \frac{1}{1} = e^2 e^2 a^4 a
  vector<T> convolve(vector<T> as, vector<T> bs) { // hash-5
   int N = int(as.size()), M = int(bs.size());
   int K = N + M - 1, S = nxt pow2(K); init(S);
   if (min(N, M) \le 64) {
     vector<T> res(K);
     for (int u = 0; u < N; ++u) for (int v = 0; v < M; ++v)
       res[u + v] = res[u + v] + as[u] * bs[v];
     return res;
    } else {
     as.resize(S), bs.resize(S);
     fft(as, false); fft(bs, false);
     for (int i = 0; i < S; ++i) as[i] = as[i] * bs[i];
```

```
fft(as, true); as.resize(K); return as;
 h // hash-5 = e4b903
}; FFT<M0> FFT0;
// T = \{unsigned, unsigned long long, modnum \in M>\}
// Remark: need to satisfy |poly| * mod^2 < prod_{i} M_i
template < class T, unsigned M0, unsigned M1, unsigned M2,
    unsigned M3, unsigned M4>
T garner(modnum<M0> a0, modnum<M1> a1, modnum<M2> a2, modnum<M3
    > a3, modnum<M4> a4) { // hash-6
 static const modnum<M1> INV_M0_M1 = modnum<M1>(M0).inv();
 static const modnum<M2> INV_M0M1_M2 = (modnum<M2>(M0) * M1).
 // static const modnum
M3> INV_M0M1M2_M3 = (modnum</pr>
M3>(M0) *
       M1 * M2).inv();
 // static const modnum<M>> INV_M0M1M2M3_M> (modnum<M>> (M0)
       * M1 * M2 * M3).inv();
 const modnum<M1> b1 = INV_M0_M1 * (a1 - a0.x);
 const modnum<M2> b2 = INV_M0M1_M2 * (a2 - (modnum<M2>(b1.x) *
       M0 + a0.x));
 // const modnum \le M \gg b3 = INV\_MOM1M2\_M3 * (a3 - ((modnum \le M3)))
       b2.x) * M1 + b1.x) * M0 + a0.x));
 // const modnum M > b4 = INV M0M1M2M3 M + (a4 - (((modnum M))))
      >(b3.x) * M2 + b2.x) * M1 + b1.x) * M0 + a0.x);
 return (T(b2.x) * M1 + b1.x) * M0 + a0.x;
 // return (((T(b4.x) * M3 + b3.x) * M2 + b2.x) * M1 + b1.x) *
       M0 + a0.x;
\frac{1}{100} / \frac{1}{100} hash - 6 = b93180
// results must be in [-448002610255888384, 448002611254132736]
vector<11> convolve(const vector<11>& as, const vector<11>& bs)
     \{ // hash-7 \}
 static constexpr unsigned M0 = M0::M, M1 = M1::M;
 static const modnum<M1> INV M0 M1 = modnum<M1>(M0).inv();
 if (as.empty() || bs.empty()) return {};
 const int len_as = int(as.size()), len_bs = int(bs.size());
 vector<modnum<M0>> as0(len_as), bs0(len_bs);
 for (int i = 0; i < len_as; ++i) as0[i] = as[i];
 for (int i = 0; i < len_bs; ++i) bs0[i] = bs[i];
 const vector<modnum<M0>> cs0 = FFT0.convolve(as0, bs0);
 vector<modnum<M1>> as1(len_as), bs1(len_bs);
 for (int i = 0; i < len_as; ++i) as1[i] = as[i];
 for (int i = 0; i < len bs; ++i) bs1[i] = bs[i];
 const vector<modnum<M1>> cs1 = FFT1.convolve(as1, bs1);
 vector<ll> cs(len as + len bs - 1);
 for (int i = 0; i < len_as + len_bs - 1; ++i) {
    const modnum<M1> d1 = INV_M0_M1 * (cs1[i] - cs0[i].x);
    cs[i] = (d1.x > M1 - d1.x)
     ? (-1ULL - (static_cast<unsigned ll>(M1 - 1U - d1.x) * M0
            + (M0 - 1U - cs0[i].x))
     : (static_cast<unsigned ll>(d1.x) * M0 + cs0[i].x);
 return cs;
\frac{1}{2} // hash-7 = a3bae7
fast-subset-transform.h
```

Description: Transform to a basis with fast convolutions of the form $c[z] = \sum_{z=x \oplus y} a[x] \cdot b[y]$, where \oplus is one of AND, OR, XOR. The size of a must be a power of two.

```
Time: \mathcal{O}(N \log N) 5b9574, 16 lines void FST(vector<int> &a, bool inv) {
    for (int n = a.size(), step = 1; step < n; step *= 2) {
        for (int i = 0; i < n; i += 2 * step) for(int j = i; j < i + step; ++j) {
            int &u = a[j], &v = a[j + step]; tie(u, v) = inv ? pii(v - u, u) : pii(v, u + v); // AND inv ? pii(v, u - v) : pii(u + v, u); // OR pii(u + v, u - v); // XOR
```

```
}
if (inv) for(auto &x : a) x /= a.size(); // XOR only
}
vector<int> conv(vector<int> a, vector<int> b) {
  FST(a, 0); FST(b, 0);
  for(int i = 0; i < a.size(); ++i) a[i] *= b[i];
  FST(a, 1); return a;
}
</pre>
```

sum-of-powers.h

Description: Computes monomials and sum of powers product certain polynomials. Check "General purpose numbers" section for more info. (Monomials).

```
mials) pw(x) = x^d for a fixed d. \sum_{x=0}^{\infty} r^x f(x). (degree of f \le d). \sum_{x=0}^{N-1} r^x f(x).
```

```
(degree of f \leq d).
"../number-theory/modular-arithmetic.h", "/lagrange.h"
vector<num> get_monomials(int N, long long d) { // hash-1
 vector<int> pfac(N);
  for (int i = 2; i < N; ++i) pfac[i] = i;
  for (int p = 2; p < N; ++p) if (pfac[p] == p)
   for (int m = 2*p; m < N; m += p) if (pfac[m] > p) pfac[m] = p;
  vector<num> pw(N);
  for (int i = 0; i < N; ++i)
   if (i \le 1 \mid | pfac[i] == i) pw[i] = num(i).pow(d);
    else pw[i] = (pw[pfac[i]] * pw[i / pfac[i]]);
  return pw;
\frac{1}{hash-1} = 966124
num sum_of_power_limit(num r, int d, const vector<num>& fs) {
  interpolator_t<num> M(d + 2); num s = 1; auto gs = fs;
  for (int x = 0; x \le d; ++x, s *= r) qs[x] *= s;
  num ans = 0, cur_sum = 0; s = 1;
  for (int x = 0; x \le d; ++x, s *= -r) {
    cur\_sum += choose(d+1, x) * s; ans += cur\_sum * qs[d-x];
  } ans *= (1 - r).pow(-(d + 1));
 return ans;
\frac{1}{2} / \frac{1}{2} hash - 2 = d5b811
num sum of power(num r, int d, vector<num>& fs, 11 N) { // hash
  if (r == 0) return (0 < N) ? fs[0] : 0;
  interpolator t<num> M(d + 2);
  vector<num> qs(d + 2); qs[0] = 0; num s = 1;
  for (int x = 0; x \le d; ++x, s *= r)
   qs[x + 1] = qs[x] + s * fs[x];
  if (r == 1) return M.interpolate(gs, N);
  const num c = sum_of_power_limit(r, d, fs);
  const num r inv = r.inv(); num w = 1;
  for (int x = 0; x \le d + 1; ++x, w *= r_inv)
   gs[x] = w * (gs[x] - c);
  return c + r.pow(N) * M.interpolate(gs, N);
\frac{1}{hash-3} = 62a62d
```

power-series.h

```
"fast-fourier-transform.h", "../number-theory/mod-sqrt.h",

"../number-theory/preparator.h"

6c18f3, 131 lines

using num = modnum<998244353U>; FFT<num> fft_data;

using P = vector<num>;

void shrink(P& P) { while (!P.empty() &&!P.back()) P.pop_back();}

P& operator+=(P& a, const P& b) { // hash-1
    int N = int(a.size()), M = int(b.size());
    a.resize(max(N, M));
    for (int i = 0; i < M; ++i) a[i] += b[i];
    return a;
} // hash-1 = 2bef29
P operator+(const P& a,const P& b) { P r=a; return r+=b;}

P& operator -= (P& a, const P& b) { // hash-2
    int N = int(a.size()), M = int(b.size());
```

```
a.resize(max(N, M));
    for (int i = 0; i < M; ++i) a[i] -= b[i];
    return a;
// hash-2 = 6c3395
P operator-(const P& a, const P& b) {P r=a; return r-=b;}
P operator*(const P& a, const P& b) {
    return fft.convolve(a,b); }
P& operator*=(P& a, const P& b) { return a=a*b; }
// inverse series mod x^N
P inverse (const P& P, int N) { // hash-3
    if (P.empty()) return {};
    P b({P[0]}), ret = {P[0].inv()};
    for (int len = 1; len < N; len *= 2) {
        for (int i = len; i < min(2*len, int(P.size())); ++i)
            b.push_back(P[i]);
         (ret \star = P\{2\} - b \star ret).resize(2\starlen);
    ret.resize(N); return ret;
\frac{1}{2} // hash-3 = e62bca
P operator/(P a, P b) { // hash-4
    int s = int(a.size()) - int(b.size()) + 1;
    if (s <= 0) return {};
    reverse(a.begin(), a.end()); reverse(b.begin(), b.end());
    a.resize(s); b.resize(s); a *= inverse(std::move(b), s);
    a.resize(s); reverse(a.begin(), a.end());
    return a;
\frac{1}{hash-4} = 9a630a
P& operator/=(P& a, const P& b) {return a = a / b;}
P& operator%=(P& a, const P& b) { // hash-5
    if (a.size() >= b.size()) {
    P c = (a/b) * b; a.resize(b.size()-1);
    for (int i = 0; i < int(a.size()); ++i)
      a[i] = a[i]-c[i];
  shrink(a); return a;
\frac{1}{100} / \frac{1}{100} hash - 5 = 871616
P operator% (const P& a, const P& b) {P r=a; return r%=b;}
P deriv(P P) { // hash-6
    int N = int(P.size());
    if (N == 0) return {};
    for (int x = 1; x < N; ++x) f[x-1] = x * P[x];
    return f;
\frac{1}{100} / \frac{1}{100} hash - 6 = 8c328d
P integ(P P) { // hash-7
    int N = int(P.size());
    if (N == 0) return {};
    P f(N+1); f[1] = 1;
    for (int x = 0; x < N; ++x) f[x+1] = invs[x+1] * P[x];
    return f;
\frac{1}{2} // hash-7 = bbdd46
// ln(P) mod x^N
P log(const P& P, int N) { // hash-8
    if (P.empty()) return {};
    P f = integ(deriv(P) * inverse(P, N));
    f.resize(N); return f;
\frac{1}{100} / \frac{1}{100} hash - 8 = 76ed43
 // exp(P) \mod x^N
P exp(P P, int N) { // hash-9
    if (P.emptv()) return {1};
    P b(\{P[0]+1\}), ret = \{1\};
    for (int len = 1; len < N; len *= 2) {
        for (int i = len; i < min(2*len, int(P.size())); ++i)
            b.push_back(P[i]);
         (ret \star= (b - log(ret, 2\starlen))).resize(2\starlen);
    ret.resize(N); return ret;
\frac{1}{100} / \frac{1}{100} hash-9 = 71a111
P pow(P a, ll e, int N) { // hash-10
```

```
P b(N);
                  if (!e) { b[0] = 1; return b; }
                  int p = 0;
                  while (e*p < N \&\& a[p].x == 0) ++p;
                  if (1LL*e*p >= N) return b;
                  num mu = a[p].pow(e), di = a[p].inv();
                  int M = e * p; P c(N-M);
                  for (int x = 0; x < N-M; ++x) c[x] = a[x+p] * di;
                  c = log(c, N-M);
                  for (auto& x : c) x = x * e;
                  c = \exp(c, N-M);
                  for (int x = 0; x < int(c.size()); ++x) b[x+M] = c[x]*mu;
h // hash-10 = af6c8e
P eval(const P& a, const vector<num>& x) { // hash-11
       int N = int(x.size());
        if (!N) return {};
         vector<P> up (2*N), down (2*N);
         for (int i = 0; i < N; ++i) up[i+N]=P(\{0-x[i],1\});
        for (int i = N-1; i \ge 1; --i) up[i]=up[2*i]*up[2*i+1];
         down[1] = a % up[1];
         for (int i = 2; i < 2*N; ++i) down[i]=down[i/2]%up[i];
         vector<num> v(N);
         for (int i = 0; i < N; ++i)
                y[i] = down[i+N].empty() ? 0 : down[i+N][0];
         return y;
 \frac{1}{2} / \frac{1}{2} = \frac{1}
P interp(const vector<num>&x, const vector<num>&y) { // hash-12
       int N = int(x.size()); assert(N);
         vector<P> up (2*N), down (2*N);
         for (int i = 0; i < N; ++i) up[i+N]=P(\{0-x[i],1\});
         for (int i = N-1; i >= 1; --i) up [i] = up [2*i] * up [2*i+1];
         vector<num> a = eval(deriv(up[1]), x);
         for (int i = 0; i < N; ++i) down[i+N]=P({y[i]*a[i].inv()});
         for (int i = N-1; i >= 1; --i)
                  down[i] = down[2*i]*up[2*i+1] + down[2*i+1]*up[2*i];
         return down[1];
 \frac{1}{2} / \frac{1}{2} = \frac{1}{2} = \frac{1}{2} 
P taylor shift (P a, int N, int K) { // hash-13
       P P(N), Q = a;
         for (int i = 1; i < N; ++i) P[i] += P[i-1] * K;
         for (int i = 1; i < N; ++i) P[i] *= ifact[i];
         reverse(P.begin(), P.end());
         for (int i = 1; i < N; ++i) Q[i] *= fact[i];
        for (int i = 0; i < N; ++i) P[i] = P[N-1+i] * ifact[i];
        P.resize(N);
       return P;
 \frac{1}{100} / \frac{1}{100} = \frac{1}
```

4.1.1 LP formulation

Standard form: maximize $\mathbf{c}^T \mathbf{x}$ subject to $A\mathbf{x} \leq \mathbf{b}$ and $\mathbf{x} \geq 0$.

Dual LP: minimize $\mathbf{b}^T \mathbf{y}$ subject to $A^T \mathbf{y} \geq \mathbf{c}$ and $\mathbf{y} \geq 0$. $\bar{\mathbf{x}}$ and $\bar{\mathbf{y}}$ are optimal if and only if for all $i \in [1, n]$, either $\bar{x}_i = 0$ or $\sum_{j=1}^m A_{ji}\bar{y}_j = c_i$ holds and for all $i \in [1, m]$ either $\bar{y}_i = 0$ or $\sum_{j=1}^n A_{ij}\bar{x}_j = b_j$ holds.

- 1. In case of minimization, let $c_i' = -c_i$
- 2. $\sum_{1 \le i \le n} A_{ji} x_i \ge b_j \to \sum_{1 \le i \le n} -A_{ji} x_i \le -b_j$
- $3. \sum_{1 \le i \le n} A_{ji} x_i = b_j$
 - $\bullet^- \bar{\sum}_{1 \le i \le n} A_{ji} x_i \le b_j$
 - $\sum_{1 \le i \le n}^{-} A_{ji} x_i \ge b_j$

4. If x_i has no lower bound, replace x_i with $x_i - x_i'$

4.1.2 Generating functions

A list of generating functions for useful sequences:

| $(1,1,1,1,1,1,\ldots)$ | $\frac{1}{1-z}$ |
|---------------------------------------------------------------|-------------------------|
| $(1,-1,1,-1,1,-1,\ldots)$ | $\frac{1}{1+z}$ |
| $(1,0,1,0,1,0,\ldots)$ | $\frac{1}{1-z^2}$ |
| $(1,0,\ldots,0,1,0,1,0,\ldots,0,1,0,\ldots)$ | $\frac{1}{1-z^2}$ |
| $(1,2,3,4,5,6,\ldots)$ | $\frac{1}{(1-z)^2}$ |
| $(1, \binom{m+1}{m}, \binom{m+2}{m}, \binom{m+3}{m}, \ldots)$ | $\frac{1}{(1-z)^{m+1}}$ |
| $(1,c,\binom{c+1}{2},\binom{c+2}{3},\ldots)$ | $\frac{1}{(1-z)^c}$ |
| $(1,c,c^2,c^3,\ldots)$ | $\frac{1}{1-cz}$ |
| $(0,1,\frac{1}{2},\frac{1}{3},\frac{1}{4},\ldots)$ | $\ln \frac{1}{1-z}$ |

A neat manipulation trick is:

$$\frac{1}{1-z}G(z) = \sum_{n} \sum_{k \le n} g_k z^n$$

Number theory (5)

5.1 Modular arithmetic

modular-arithmetic.h

Description: Operators for modular arithmetic.

5a35b8, 27 lines template<unsigned M > struct modnum { static constexpr unsigned M = M_; using num = modnum; using ll = int64 t; using ull = uint64 t; unsigned x; num& norm(unsigned a) {x = a < M ? a : a - M; return *this;}</pre> constexpr modnum(11 = 0): x(unsigned((a %= 11(M)) < 0 ? a+M: a)) {} explicit operator int() const { return x; } num& operator+=(const num& a) { return norm(x+a.x); } num& operator = (const num& a) { return norm(x-a.x+M); } num& operator *= (const num& a) { return norm (unsigned (ull(x) *a. x % M)): } num& operator/=(const num& a) { return (*this *= a.inv());} template<typename T> friend num operator+(T a, const num& b) { return (num(a) += b); } template<typename T> friend num operator-(T a, const num& b) { return (num(a) -= b); } template<typename T> friend num operator*(T a, const num& b) { return (num(a) *= b); } template<typename T> friend num operator/(T a, const num& b) { return (num(a) /= b); } num operator+() const { return *this; } num operator-() const { return num() - *this; } num pow(ll e) const { if (e < 0) { return inv().pow(-e); } num b = x, xe = 1U; for (; e; e >>= 1) { if (e & 1) xe *= b; b *= b; } return xe: num inv() const { return minv(x, M); } friend num inv(const num& a) { return a.inv(); } explicit operator bool() const { return x; } friend bool operator == (const num& a, const num& b) {return a.x == b.x;friend bool operator!=(const num& a, const num& b){return a.x ! = b.x;

mod-inv.h

Description: Find x such that $ax \equiv 1 \pmod{m}$. The inverse only exist if a and m are coprimes.

```
template<typename T> T minv(T a, T m) {
 a %= m; assert(a);
 return a == 1 ? 1 : T(m - i64(minv(m, a)) * m / a);
```

mod-sum.h

Description: Sums of mod'ed arithmetic progressions. modsum(to, c, k, m) = $\sum_{i=0}^{t=0} (ki+c)\%m$. divsum is similar but for floored division.

Time: $\log(m)$, with a large constant.

decfb8, 16 lines

```
typedef unsigned long long ull;
ull sumsq(ull to) { return to /2 * ((to-1) | 1); }
ull divsum(ull to, ull c, ull k, ull m) { // hash-1
  ull res = k / m * sumsq(to) + c / m * to;
  k %= m; c %= m;
  if (k) {
   ull to2 = (to * k + c) / m;
   res += to * to2;
   res -= divsum(to2, m-1 - c, m, k) + to2;
 return res;
\frac{1}{2} // hash-1 = ae0cdb
lint modsum(ull to, lint c, lint k, lint m) { // hash-2
 c = ((c % m) + m) % m; k = ((k % m) + m) % m;
  return to * c + k * sumsq(to) - m * divsum(to, c, k, m);
\frac{1}{hash-2} = 29f27f
```

mod-mul.h

Description: Calculate $a \cdot b \mod c$ (or $a^b \mod c$) for $0 \le a, b \le c \le 7.2 \cdot 10^{18}$. **Time:** $\mathcal{O}(1)$ for modmul, $\mathcal{O}(\log b)$ for modpow 59afa8, 11 lines

```
typedef unsigned long long ull;
ull modmul(ull a, ull b, ull M) { // hash-1
 lint ret = a * b - M * ull(1.L / M * a * b);
  return ret + M * (ret < 0) - M * (ret >= (lint)M);
\frac{1}{1} / \frac{1}{1} hash-1 = e1a2a4
ull modpow(ull b, ull e, ull mod) { // hash-2
  ull ans = 1;
  for (; e; b = modmul(b, b, mod), e /= 2)
    if (e & 1) ans = modmul(ans, b, mod);
  return ans;
\frac{1}{hash-2} = 100b91
```

mod-sqrt.h

Description: Tonelli-Shanks algorithm for modular square roots. Finds x s.t. $x^2 = a \pmod{p}$ (-x gives the other solution).

Time: $\mathcal{O}(\log^2 p)$ worst case, $\mathcal{O}(\log p)$ for most p

abffbe, 33 lines

```
int jacobi(ll a, ll m) { // hash-1
 int s = 1;
  if (a < 0) a = a % m + m;
  for (; m > 1; ) {
   a %= m; if (a == 0) return 0;
   const int r = __builtin_ctzll(a);
   if ((r \& 1) \&\& ((m + 2) \& 4)) s = -s;
   a >>= r; if (a \& m \& 2) s = -s;
    swap(a, m);
  } return s;
\frac{1}{2} // hash-1 = aacc12
vector<11> mod_sqrt(11 a, 11 p) { // hash-2
  if (p == 2) return {a & 1};
  const int j = jacobi(a, p);
  if (j == 0) return {0};
  if (j == -1) return \{\};
  11 b, d;
```

```
while (true) {
   b = xrand() % p; d = (b * b - a) % p;
   if (d < 0) d += p;
   if (jacobi(d, p) == -1) break;
 11 f0 = b, f1 = 1, g0 = 1, g1 = 0, tmp;
 for (11 e = (p + 1) >> 1; e; e >>= 1) {
   if (e & 1) {
     tmp = (g0 * f0 + d * ((g1 * f1) % p)) % p;
     g1 = (g0 * f1 + g1 * f0) % p; g0 = tmp;
   tmp = (f0 * f0 + d * ((f1 * f1) % p)) % p;
   f1 = (2 * f0 * f1) % p; f0 = tmp;
 return (g0<p-g0) ? vector<l1>{g0,p-g0} : vector<l1>{p-g0,g0};
\frac{1}{a} / \frac{1}{a} hash - 2 = b22da7
```

mod-range.h

```
Description: min x \ge 0 s.t. l \le ((ax) \mod m) \le r, m > 0, a \ge 0.
```

```
template<typename T> T mod_range(T m, T a, T l, T r) {
1 = \max(1, T(0)); r = \min(r, m - 1);
 if (1 > r) return -1;
 a %= m;
 if (a == 0) return (1 > 0) ? -1 : 0;
 const T k = (1 + a - 1) / a;
 if (a * k <= r) return k;
 const T y = mod_range(a, m, a * k - r, a * k - 1);
 return (y == -1) ? -1 : ((m * y + r) / a);
```

5.2 Primality

sieve.h

Description: Prime sieve for generating all primes up to a certain limit. pfac[i] is the lowest prime factor of i. Also useful if you need to compute any multiplicative function.

```
Time: \mathcal{O}(N)
```

```
a0b9c3, 17 lines
vector<int> run sieve(int N) {
 vector\langle int \rangle pfac(N+1), primes, mu(N+1,-1), phi(N+1);
 primes.reserve(N+1); mu[1] = phi[1] = 1;
 for (int i = 2; i \le N; ++i) {
   if (!pfac[i])
     pfac[i] = i, phi[i] = i-1, primes.push_back(i);
   for (int p : primes) {
     if (p > N/i) break;
     pfac[p * i] = p; mu[p * i] *= mu[i];
     phi[p * i] = phi[i] * phi[p];
      if (i % p == 0) {
       mu[p * i] = 0; phi[p * i] = phi[i] * p;
       break:
 } return primes;
```

miller-rabin.h

Description: Deterministic Miller-Rabin primality test. Guaranteed to work for numbers up to 2^{64} ; for larger numbers, extend A randomly.

Time: 7 times the complexity of $a^b \mod c$.

```
"mod-mul.h"
                                                     bbee97, 12 lines
bool isPrime(ull n) { // hash-1
 if (n < 2 | | n % 6 % 4 != 1) return (n | 1) == 3;
 vector<ull> A = {2, 325, 9375, 28178, 450775, 9780504,
 ull s = __builtin_ctzll(n-1), d = n >> s; // hash-1 = 8cef21
 for(ull a : A) { // ^ count trailing zeroes
   ull p = modpow(a % n, d, n), i = s;
```

```
while (p != 1 && p != n - 1 && a % n && i--)
   p = modmul(p, p, n);
  if (p != n-1 && i != s) return 0;
return 1:
```

pollard-rho.h

Description: Pollard-rho randomized factorization algorithm. Returns prime factors of a number, in arbitrary order (e.g. 2299 -> {11, 19, 11}).

Time: $\mathcal{O}\left(n^{1/4}\right)$, less for numbers with small factors.

```
"mod-mul.h", "extended-euclid.h", "miller-rabin.h"
                                                                                                                                                                                                                                                                                                               6bf31f, 17 lines
ull pollard(ull n) { // hash-1
          auto f = [n] (ull x, ull k) { return modmul(x, x, n) + k; };
         ull x = 0, y = 0, t = 30, prd = 2, i = 1, q;
          while (t++ % 40 || gcd(prd, n) == 1) {
                    if (x == y) x = ++i, y = f(x, i);
                     if ((q = modmul(prd, max(x,y) - min(x,y), n))) prd = q;
                     x = f(x, i), y = f(f(y, i), i);
         return gcd(prd, n);
   \frac{1}{1} / \frac{1}{1} = 8875ba
  vector<ull> factor(ull n) { // hash-2
         if (n == 1) return {};
         if (isPrime(n)) return {n};
         ull x = pollard(n); auto l = factor(x), r = factor(n/x);
         l.insert(l.end(), r.begin(), r.end());
         return 1:
  \frac{1}{100} \frac{1}
```

5.3 Divisibility

extended-euclid.h

Description: Finds two integers x and y, such that $ax + by = \gcd(a, b)$. If a and b are coprime, then x is the inverse of $a \pmod{b}$. 8b62c4, 6 lines

```
template<typename T>
T egcd(T a, T b, T &x, T &y) {
 if (!a) { x = 0, y = 1; return b; }
 T g = egcd(b % a, a, y, x);
 x = y * (b/a); return q;
```

division-lemma.h

Description: This lemma let us exploit the fact that he sequence (harmonic on integer division) has at most $2\sqrt{N}$ distinct elements, so we can iterate through every possible value of $\lfloor \frac{N}{i} \rfloor$, using the fact that the greatest integer j satisfying $\lfloor \frac{N}{i} \rfloor = \lfloor \frac{N}{j} \rfloor$ is $\lfloor \frac{N}{\lfloor \frac{N}{2} \rfloor} \rfloor$. This one computes the $\sum_{i=1}^{N} \lfloor \frac{N}{i} \rfloor i$.

```
Time: \mathcal{O}\left(\sqrt{N}\right)
                                                                      b2c1ab, 15 lines
int res = 0:
for (int a = 1, b; a \le N; a = b + 1) { // floor
```

```
b = N / (N / a);
 // quotient (N/a) and there are (b-a+1) elements
 int 1 = b - a + 1, r = a + b; // l * r / 2 = sum(i, j)
 if (1 & 1) r /= 2;
 else 1 /= 2;
 res += 1 * r * (N / a);
// [1, N), need to deal with case where a = N separately
for (int a = 1, b; a < N; a = b + 1) { // ceil
 const int k = (N - 1) / a + 1; // quotient k
 b = (N - 1) / (k - 1);
 int cnt = b - a + 1; // occur cnt times on interval [a, b]
```

divisors.h

Description: Generate all factors of n given it's prime factorization.

```
Time: \mathcal{O}\left(\frac{\sqrt{N}}{\log N}\right)
```

phi-function.h

```
const int n = int(le5)*5; vector<int> phi(n);
void calculatePhi() {
  for(int i = 0; i < n; ++i) phi[i] = i&1 ? i : i/2;
  for(int i = 3; i < n; i += 2) if (phi[i] == i)
    for(int j = i; j < n; j += i) phi[j] -= phi[j]/i;
}</pre>
```

discrete-log.h

Description: Returns the smallest x >= 0 s.t. $a^x = b \pmod{m}$, or -1 if no such x exists. modLog(a,1,m) can be used calculate the order of a. Assumes that $0^0 = 1$.

Time: $\mathcal{O}\left(\sqrt{m}\right)$

```
"extended-euclid.h"
                                                        62fc5e, 15 lines
template<typename T> T modLog(T a, T b, T m) {
 T k = 1, it = 0, g; // hash-1
  while ((g = gcd(a, m)) != 1) {
   if (b == k) return it;
    if (b % g) return -1;
   b /= q; m /= q; ++it; k = k * a / q % m;
  \frac{1}{100} / \frac{1}{100} hash-1 = 416572
  T n = sgrtl(m) + 1, f = 1, j = 1; // hash-2
 unordered_map<T, T> A;
  while (j \le n)
   f = f * a % m, A[f * b % m] = j++;
  for(int i = 1; i \le n; ++i) if (A.count(k = k * f % m)
   return n * i - A[k] + it;
  return -1; // hash-2 = 25c7bf
```

prime-counting.h

Description: Count the number of primes up to N. Also useful for sum of primes

```
Time: \mathcal{O}(N^{3/4}/\log N)
```

513314, 21 lines

da7671, 6 lines

```
for (11 i = 2; i*i <= N; ++i) {
    if (dp[i-1] == dp[i-2]) continue;
    for (int j = int(w.size())-1; w[j] >= i*i; --j)
        dp[j] -= dp[get(w[j]/i)] - dp[i-2];
}
return dp.back(); // hash-2 = c6b848
}
};
```

5.4 Chinese remainder theorem

chinese-remainder.h

Description: Chinese Remainder Theorem. crt (a, m, b, n) computes x such that $x \equiv a \pmod m$, $x \equiv b \pmod n$. If |a| < m and |b| < n, x will obey $0 \le x < \operatorname{lcm}(m,n)$. Assumes $mn < 2^{62}$.

Time: $\mathcal{O}(\log(LCM(m)))$

5.5 Fractions

fractions.h

Description: Template that helps deal with frtions.

596163, 28 lines

```
template<typename num> struct fraction_t {
 num p, q; using fr = fraction_t; // hash-1
 fraction_t() : p(0), q(1) { }
 fraction_t (num _n, num _d = 1): p(_n), q(_d) {
   num g = gcd(p, q); p \neq g, q \neq g;
   if (q < 0) p *= -1, q *= -1; assert(q != 0);
 \frac{1}{hash-1} = 2306e9
 friend bool operator<(const fr& 1, const fr& r) { // hash-2
   return l.p*r.q < r.p*l.q;}
 friend bool operator == (const fr& 1, const fr& r) {return 1.p
      == r.p && l.q == r.q;}
 friend bool operator!=(const fr& 1, const fr& r){return !(1
 friend fr operator+(const fr& 1, const fr& r) {
   num q = \gcd(1.q, r.q);
   return fr(r.q / q * 1.p + 1.q / q * r.p, 1.q / q * r.q);
 h // hash-2 = 604bf5
 friend fr operator-(const fr& 1, const fr& r) { // hash-3
   num g = gcd(1.q, r.q);
   return fr( r.q / g * l.p - l.q / g * r.p, l.q / g * r.q);
 friend fr operator*(const fr& 1, const fr& r){
   return fr(1.p*r.p, 1.g*r.g);}
 friend fr operator/(const fr& 1, const fr& r) {
   return 1*fr(r.q,r.p); // hash-3 = 9d4fb0
 friend fr& operator+=(fr& 1, const fr& r) {return l=1+r;}
 friend fr& operator==(fr& 1, const fr& r) {return l=l-r;}
 template<class T> friend fr& operator*=(fr& 1, const T& r){
      return l=1*r;}
 template < class T > friend fr& operator /= (fr& 1, const T& r) {
      return l=1/r;}
```

continued-fractions.h

Description: Given N and a real number $x \ge 0$, finds the closest rational approximation p/q with $p, q \le N$. It will obey $|p/q - x| \le 1/qN$.

For consecutive convergents, $p_{k+1}q_k - q_{k+1}p_k = (-1)^k$. $(p_k/q_k$ alternates between > x and < x.) If x is rational, y eventually becomes ∞ ; if x is the root of a degree 2 polynomial the a's eventually become cyclic.

```
Time: \mathcal{O}(\log N)
typedef double dbl; // for N \sim 1e7; long double for N \sim 1e9
pair<11, 11> approximate(dbl x, 11 N) {
 ll LP = 0, LQ = 1, P = 1, Q = 0, inf = 11(1e18); dbl y = x;
    ll lim = min(P ? (N-LP) / P : inf, O ? (N-LO) / O : inf),
       a = (11) floor(y), b = min(a, lim),
       NP = b*P + LP, NQ = b*Q + LQ;
    if (a > b) { // hash-1
      // If b > a/2, we have a semi-convergent that gives us a
      // better approximation; if b = a/2, we *may* have one.
      // Return {P, Q} here for a more canonical approximation.
      return (abs(x - (dbl)NP / (dbl)NQ) < abs(x - (dbl)P / (dbl)NQ)
           db1)0)) ?
      make_pair(NP, NQ) : make_pair(P, Q);
    if (abs(y = 1/(y - (dbl)a)) > 3*N) return \{NP, NQ\};
    LP = P; P = NP; LO = O; O = NO;
 } // hash-1 = bfee6a
```

frac-binary-search.h

Description: Given f and N, finds the smallest fraction $p/q \in [0,1]$ such that f(p/q) is true, and $p,q \leq N$. You may want to throw an exception from f if it finds an exact solution, in which case N can be removed.

Usage: fracBS([](Frac f) { return f.p>=3*f.q; }, 10); // {1,3} Time: $\mathcal{O}(\log(N))$

```
struct Frac { ll p, q; };
template < class F > Frac fracBS(F f, 11 N) {
 bool dir = 1, A = 1, B = 1;
 Frac left{0, 1}, right{1, 1}; //right{1,0} to search (0,N]
 assert(!f(left)); assert(f(right));
  while (A | | B) { // hash-1
   11 adv = 0, step = 1; // move right if dir, else left
    for (int si = 0; step; (step *= 2) >>= si) {
      adv += step;
      Frac mid{left.p * adv + right.p, left.q * adv + right.q};
      if (abs(mid.p) > N || mid.q > N || dir == !f(mid)) {
        adv -= step; si = 2;
    right.p += left.p * adv; right.q += left.q * adv;
    dir = !dir; swap(left, right);
    A = B; B = !!adv;
  \frac{1}{hash-1} = dedbc8
 return dir ? right : left;
```

5.5.1 Pythagorean Triples

The Pythagorean triples are uniquely generated by

```
a = k \cdot (m^2 - n^2), b = k \cdot (2mn), c = k \cdot (m^2 + n^2),
```

with m > n > 0, k > 0, $m \perp n$, and either m or n even.

5.6 Primes

p=962592769 is such that $2^{21}\mid p-1$, which may be useful. For hashing use 970592641 (31-bit number), 31443539979727 (45-bit), 3006703054056749 (52-bit). There are 78498 primes less than 1000000.

5.6.1 Prime counting function $(\pi(x))$

The prime counting function is asymptotic to $\frac{x}{\log x}$, by the prime number theorem.

| x | 10 | 10^{2} | 10^{3} | 10^{4} | 10^{5} | 10^{6} | 10^{7} | 10^{8} |
|----------|----|----------|----------|----------|----------|----------|----------|-----------|
| $\pi(x)$ | 4 | 25 | 168 | 1.229 | 9.592 | 78.498 | 664.579 | 5.761.455 |

5.6.2 Sum of primes

For any multiplicative f:

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

5.6.3 Moebius Function

$$\mu(n) = \begin{cases} 0 & n \text{ is not square free} \\ 1 & n \text{ has even number of prime factors} \\ -1 & n \text{ has odd number of prime factors} \end{cases}$$

Moebius Inversion:

$$g(n) = \sum_{d|n} f(d) \Leftrightarrow f(n) = \sum_{d|n} \mu(d)g(n/d)$$

Other useful formulas/forms:

$$\sum_{d|n} \phi(d) = n$$

$$\sum_{\substack{i < n \\ \gcd(i,n)=1}} i = n \frac{\phi(n)}{2}$$

$$\sum_{a=1}^{n} \sum_{b=1}^{n} [\gcd(a,b) = 1] = \sum_{d=1}^{n} \mu(d) \left| \frac{n}{d} \right|^{2}$$

$$\sum_{a=1}^{n} \sum_{b=1}^{n} \gcd(a,b) = \sum_{d=1}^{n} d \sum_{d|x}^{n} \left\lfloor \frac{n}{x} \right\rfloor^{2} \mu(\frac{x}{d})$$

$$\sum_{a=1}^{n} \sum_{b=a}^{n} \gcd(a,b) = \sum_{d=1}^{n} \sum_{d|x}^{n} \phi(\frac{x}{d})d$$

$$\sum_{a=1}^{n} \sum_{b=1}^{n} \operatorname{lcm}(a,b) = \sum_{d=1}^{n} \mu(d) d \sum_{d|x}^{n} x {\binom{\lfloor \frac{n}{x} \rfloor + 1}{2}}^2$$

$$\sum_{a=1}^{n} \sum_{b=a+1}^{n} \text{lcm}(a,b) = \sum_{d=1}^{n} \sum_{d|x \wedge x > d}^{n} \phi(\frac{x}{d}) \frac{x^{2}}{2d}$$

$$\sum_{a \in S} \sum_{b \in S} \gcd(a, b) = \sum_{d=1}^{n} \left(\sum_{x \mid d} \frac{d}{x} \mu(x) \right) \left(\sum_{d \mid v} \operatorname{freq}[v] \right)^{2}$$

$$\textstyle \sum_{a \in S} \sum_{b \in S} \operatorname{lcm}(a,b) = \sum_{d=1}^n \frac{1}{d} (\sum_{x \mid d} x \mu(x)) (\sum_{d \mid v} v \cdot \operatorname{freq}[v])^2$$

$$\sum_{d|n} \mu(d) = [n=1]$$
 (very useful)

$$g(n) = \sum_{n|d} f(d) \Leftrightarrow f(n) = \sum_{n|d} \mu(d/n)g(d)$$

$$g(n) = \sum_{1 \le m \le n} f(\left| \frac{n}{m} \right|) \Leftrightarrow f(n) = \sum_{1 \le m \le n} \mu(m) g(\left| \frac{n}{m} \right|)$$

5.6.4 Dirichlet Convolution

Given a function f(x), let

$$(f * g)(x) = \sum_{d \mid x} g(d)f(x/d)$$

If the partial sums $s_{f*q}(n)$, $s_q(n)$ can be computed in O(1) and $s_f(1...n^{2/3})$ can be computed in $O\left(n^{2/3}\right)$ then all $s_f\left(\frac{n}{d}\right)$ can as well. Use

$$s_{f*g}(n) = \sum_{d=1}^{n} g(d)s_f(n/d).$$

$$\implies s_f(n) = \frac{s_{f*g}(n) - \sum_{d=2}^n g(d)s_f(n/d)}{g(1)}$$

- 1. If $f(x) = \mu(x)$ then g(x) = 1, (f * g)(x) = (x == 1), and $s_f(n) = 1 - \sum_{i=2}^{n} s_f(n/i)$
- 2. If $f(x) = \phi(x)$ then g(x) = 1, (f * g)(x) = x, and $s_f(n) = \frac{n(n+1)}{2} - \sum_{i=2}^n s_f(n/i)$

dirichlet-convolution.h

Description: Dirichlet convolution. Change f, gs and fgs accordingly. This example calculates $\phi(N)$.

Time:
$$\mathcal{O}\left(N^{\frac{2}{3}}\right)$$
 eac754, 21 lines

```
template<typename T, typename V> struct mertens {
 V N; T inv; // \sim N^{\frac{1}{2}/3}
 vector<V> fs; vector<T> psum;
 unordered_map<V, T> mapa;
 V f(V x) { return fs[x]; } // hash-1
 T fgs(V x) { return T(x) * (x + 1) / 2; }
 mertens(V M, const vector\langle V \rangle \& F) : N(M+1), fs(F), psum(M+1){
    for (V a = 0; a + 1 < N; ++a)
      psum[a + 1] = f(a + 1) + psum[a];
 \frac{1}{2} // hash-1 = ceee32
 T query (V x) { // hash-2
    if (x < N) return psum[x];
    if (mapa.find(x) != mapa.end()) return mapa[x];
    for (V a = 2, b; a \le x; a = b + 1)
     b = x/(x/a), ans -= (gs(b)-gs(a-1)) * query(x/a);
    return mapa[x] = (ans / inv);
 \frac{1}{100} / \frac{1}{100} hash - 2 = 43d0b6
```

Combinatorial (6)

6.1 Permutations

6.1.1 Factorial

int-perm.h

Description: Permutation -> integer conversion. (Not order preserving.) Time: $\mathcal{O}(n)$ 06f<u>786</u>, 6 lines

```
int permToInt(vector<int>& v) {
 int use = 0, i = 0, r = 0;
 for (auto &x : v) r=r* ++i +__builtin_popcount(use&-(1<<x)),
                                 // (note: minus, not \sim!)
   use |= 1 << x;
 return r;
```

6.1.2 Binomials

- Sum of every element in the *n*-th row of pascal triangle is
- The product of the elements in each row is $\frac{(n+1)^n}{n!}$
- $\bullet \sum_{k=0}^{n} \binom{n}{k}^2 = \binom{2n}{n}$
- In a row p where p is a prime number, all the terms in that row except the 1s are multiples of p
- To count odd terms in row n, convert n to binary. Let x be the number of 1s in the binary representation. Then the number of odd terms will be 2^x
- Every entry in row $2^n 1$ is odd

lucas.h

Description: Lucas' thm: Let n, m be non-negative integers and p a prime. Write $n = n_k p^k + ... + n_1 p + n_0$ and $m = m_k p^k + ... + m_1 p + m_0$. Then $\binom{n}{m} \equiv \prod_{i=0}^k \binom{n_i}{m_i} \pmod{p}$. fact and ifact must hold pre-computed factorials / inverse factorials, e.g. from ModInv.h.

Time: $\mathcal{O}\left(\log_n m\right)$

rolling-binomial.h

Description: $\binom{n}{k}$ (mod m) in time proportional to the difference between (n,k) and the previous (n,k).

```
"../number-theory/preparator.h"
struct Bin {
 int N = 0, K = 0; 11 r = 1;
  void m(int a, int b) \{ r = r * a % mod * invs[b] % mod; \}
 11 choose(int n, int k) {
    if (k > n \mid \mid k < 0) return 0;
    while (N < n) ++N, m(N, N - K);
    while (K < k) ++K, m(N - K + 1, K);
    while (K > k) m (K, N - K + 1), --K;
    while (N > n) m(N - K, N), --N;
    return r;
};
```

multinomial.h

```
Description: Computes \binom{k_1 + \dots + k_n}{k_1, k_2, \dots, k_n} = \frac{(\sum k_i)!}{k_1! k_2! \dots k_n!}
                                                                     864cdb, 7 lines
lint multinomial(vector<int>& v) {
  lint c = 1, m = v.emptv() ? 1 : v[0];
  for (int i = 1 < v.size(); ++i)
     for (int j = 0; j < v[i]; ++j)
       c = c * ++m / (j+1);
  return c:
```

6.1.3 The twelvefold way (from Stanley)

How many functions $f: N \to X$ are there?

| N | X | Any f | Injective | Surjective | |
|---------|---------|----------------------------------------|---------------------|--------------------|--|
| dist. | dist. | x^n | $\frac{x!}{(x-n)!}$ | $x!\binom{n}{x}$ | |
| indist. | dist. | $\binom{x+n-1}{n}$ | $\binom{x}{n}$ | $\binom{n-1}{n-x}$ | |
| dist. | indist. | $\binom{n}{1} + \ldots + \binom{n}{x}$ | $[n \leq x]$ | $\binom{n}{k}$ | |
| indist. | indist. | $p_1(n) + \dots p_x(n)$ | $[n \leq x]$ | $p_x(n)$ | |

Where $\binom{a}{b} = \frac{1}{b!}(a)_b$, $p_x(n)$ is the number of ways to partition the integer n using x summand and $\binom{n}{x}$ is the number of ways to partition a set of n elements into x subsets (aka Stirling number of the second kind).

6.1.4 Burnside

Given a group G of symmetries and a set X, the number of elements of X up to symmetry equals

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

where X^g are the elements fixed by g (g.x = x).

If f(n) counts "configurations" (of some sort) of length n, we can ignore rotational symmetry using $G = \mathbb{Z}_n$ to get

$$g(n) = \frac{1}{n} \sum_{k=0}^{n-1} f(\gcd(n,k)) = \frac{1}{n} \sum_{k|n} f(k)\phi(n/k)$$

6.1.5 Cycles

Let the number of *n*-permutations whose cycle lenghts all belong to the set S be denoted by $q_S(n)$

$$\sum_{n=0}^{\infty} g_S(n) \frac{x^n}{n!} = \exp\left(\sum_{n \in S} \frac{x^n}{n}\right)$$

6.1.6 Involutions

An involution is a permutation with maximum cycle length 2, and it is its own inverse.

$$a(n) = a(n-1) + (n-1)a(n-2), a(0) = a(1) = 1.$$

1, 1, 2, 4, 10, 26, 76, 232, 764, 2620, 9496, 35696, 140152

6.1.7 Derangements

Permutations of a set such that none of the elements appear in their original position.

$$D(n) = (n-1)(D(n-1) + D(n-2)) = nD(n-1) + (-1)^n = \left| \frac{n!}{e} \right|$$

6.2 Partitions and subsets

6.2.1 Partition function

Number of ways of writing n as a sum of positive integers, disregarding the order of the summands.

$$p(0) = 1, \ p(n) = \sum_{k \in \mathbb{Z} \setminus \{0\}} (-1)^{k+1} p(n - k(3k - 1)/2)$$

$$p(n) \sim 0.145/n \cdot \exp(2.56\sqrt{n})$$

partitions.h

3af1e7, 14 lines

```
vector<int64_t> prep(int N) {
  vector<int64_t> dp(N); dp[0] = 1;
  for (int n = 1; n < N; ++n) {
    int64_t sum = 0;
    for (int k = 0, 1 = 1, m = n - 1; ;) {
        sum += dp[m]; if ((m -= (k += 1)) < 0) break;
        sum += dp[m]; if ((m -= (k += 1)) < 0) break;
        sum -= dp[m]; if ((m -= (k += 1)) < 0) break;
        sum -= dp[m]; if ((m -= (k += 1)) < 0) break;
        sum -= dp[m]; if ((m -= (1 += 2)) < 0) break;
    }
  if ((sum %= M) < 0) sum += M;
    dp[n] = sum;
    return dp;
}</pre>
```

6.3 General purpose numbers

6.3.1 Bernoulli numbers

EGF of Bernoulli numbers is $B(t) = \frac{t}{e^t - 1}$ (FFT-able). $B[0,...] = [1, -\frac{1}{2}, \frac{1}{6}, 0, -\frac{1}{30}, 0, \frac{1}{42},...]$

Sums of powers:

$$\sum_{i=1}^{n} n^{m} = \frac{1}{m+1} \sum_{k=0}^{m} {m+1 \choose k} B_{k} (n+1)^{m+1-k}$$

Euler-Maclaurin formula for infinite sums:

$$\sum_{i=m}^{\infty} f(i) = \int_{m}^{\infty} f(x)dx - \sum_{k=1}^{\infty} \frac{B_{k}}{k!} f^{(k-1)}(m)$$

$$\approx \int_{0}^{\infty} f(x)dx + \frac{f(m)}{2} - \frac{f'(m)}{12} + \frac{f'''(m)}{720} + O(f^{(5)}(m))$$

6.3.2 Stirling numbers of the first kind

Number of permutations on n items with k cycles.

$$c(n,k) = c(n-1,k-1) + (n-1)c(n-1,k), c(0,0) = 1$$

$$\sum_{k=0}^{n} c(n,k)x^{k} = x(x+1)\dots(x+n-1)$$

c(8, k) = 8, 0, 5040, 13068, 13132, 6769, 1960, 322, 28, 1 $c(n, 2) = 0, 0, 1, 3, 11, 50, 274, 1764, 13068, 109584, \dots$

6.3.3 Eulerian numbers

Number of permutations $\pi \in S_n$ in which exactly k elements are greater than the previous element. k j:s s.t. $\pi(j) > \pi(j+1)$, k+1 j:s s.t. $\pi(j) \geq j$, k j:s s.t. $\pi(j) > j$.

$$E(n,k) = (n-k)E(n-1,k-1) + (k+1)E(n-1,k)$$

$$E(n,0) = E(n,n-1) = 1$$

$$E(n,k) = \sum_{i=0}^{k} (-1)^{i} \binom{n+1}{j} (k+1-j)^{n}$$

6.3.4 Stirling numbers of the second kind

Partitions of n distinct elements into exactly k groups.

$$S(n,k) = S(n-1,k-1) + kS(n-1,k)$$

$$S(n,1) = S(n,n) = 1$$

$$S(n,k) = \frac{1}{k!} \sum_{j=0}^{k} (-1)^{k-j} \binom{k}{j} j^{n}$$

6.3.5 Bell numbers

Total number of partitions of n distinct elements. B(n) = 1, 1, 2, 5, 15, 52, 203, 877, 4140, 21147,

$$\mathcal{B}_{n+1} = \sum_{k=0}^{n} \binom{n}{k} \mathcal{B}_k$$

Also possible to calculate using Stirling numbers of the second kind,

$$B_n = \sum_{k=0}^{n} S(n,k)$$

If p is prime:

$$B(p^m + n) \equiv mB(n) + B(n+1) \pmod{p}$$

6.3.6 Labeled unrooted trees

on n vertices: n^{n-2} # on k existing trees of size n_i : $n_1 n_2 \cdots n_k n^{k-2}$

with degrees d_i : $(n-2)!/((d_1-1)!\cdots(d_n-1)!)$ # forests with exactly k rooted trees:

$$\binom{n}{k} k \cdot n^{n-k-1}$$

6.3.7 Catalan numbers

$$C_n = \frac{1}{n+1} {2n \choose n} = {2n \choose n} - {2n \choose n+1} = \frac{(2n)!}{(n+1)!n!}$$

$$C_0 = 1, \ C_{n+1} = \frac{2(2n+1)}{n+2}C_n, \ C_{n+1} = \sum C_i C_{n-i}$$

 $C_n = 1, 1, 2, 5, 14, 42, 132, 429, 1430, 4862, 16796, 58786, \dots$

- sub-diagonal monotone paths in a $n \times n$ grid.
- strings with *n* pairs of parenthesis, correctly nested.
- binary trees with with n+1 leaves (0 or 2 children) or 2n+1 elements.
- ordered trees with n+1 vertices.
- # ways a convex polygon with n + 2 sides can be cut into triangles by connecting vertices with straight lines.
- \bullet permutations of [n] with no 3-term increasing subsequence.

5a01bd, 29 lines

The number of monotonic lattice paths of a $n \times n$ grid that do not touch the diagonal.

$$S(n) = \frac{3(2n-3)S(n-1) - (n-3)S(n-2)}{n}$$
$$S(1) = S(2) = 1$$

1, 1, 3, 11, 45, 197, 903, 4279, 20793, 103049, 518859

6.3.9 Motzkin numbers

Number of ways of drawing any number of nonintersecting chords among n points on a circle. Number of lattice paths from (0, 0)to (n, 0) never going below the x-axis, using only steps NE, E,

$$M(n) = \frac{3(n-1)M(n-2) + (2n+1)M(n-1)}{n+2}$$

$$M(0) = M(1) = 1$$

1, 1, 2, 4, 9, 21, 51, 127, 323, 835, 2188, 5798, 15511, 41835, 113634

6.3.10 Narayana numbers

Number of lattice paths from (0,0) to (2n,0) never going below the x-axis, using only steps NE and SE, and with k peaks.

$$N(n,k) = \frac{1}{n} \binom{n}{k} \binom{n}{k-1}$$
$$N(n,1) = N(n,n) = 1$$
$$\sum_{k=0}^{n} N(n,k) = C_{n}$$

$$\sum_{k=1} N(n,k) = C_r$$

1, 1, 1, 1, 3, 1, 1, 6, 6, 1, 1, 10, 20, 10, 1, 1, 15, 50

6.3.11 Schroder numbers

Number of lattice paths from (0, 0) to (n, n) using only steps N,NE,E, never going above the diagonal. Number of lattice paths from (0, 0) to (2n, 0) using only steps NE, SE and double east EE, never going below the x-axis. Twice the Super Catalan number, except for the first term.

1, 2, 6, 22, 90, 394, 1806, 8558, 41586, 206098

6.3.12 Triangles

Given rods of length 1, ..., n,

$$T(n) = \frac{1}{24} \left\{ \begin{array}{l} n(n-2)(2n-5) & n \text{ even} \\ (n-1)(n-3)(2n-1) & n \text{ odd} \end{array} \right\}$$

is the number of distinct triangles (positive are) that can be constructed, i.e., the # of 3-subsets of [n] s.t. x < y < z and $z \neq x + y$.

6.4 Fibonacci

$$Fib(x + y) = Fib(x + 1)Fib(y) + Fib(x)Fib(y - 1)$$

$$Fib(n + 1)Fib(n - 1) - Fib(n)^{2} = (-1)^{n}$$

$$Fib(2n - 1) = Fib(n)^{2} - Fib(n - 1)^{2}$$

$$\sum_{i=0}^{n} Fib(i) = Fib(n + 2) - 1$$

$$\sum_{i=0}^{n} Fib(i)^{2} = Fib(n)Fib(n + 1)$$

$$\sum_{i=0}^{n} Fib(i)^{3} = \frac{Fib(n)Fib(n+1)^{2} - (-1)^{n}Fib(n-1) + 1}{2}$$

6.5 Linear Recurrences

$$\begin{split} F_i &= \sum_{j=1}^K C_j F_{i-j} + D \\ \begin{bmatrix} 0 & 1 & 0 & 0 & & 0 & 0 \\ 0 & 0 & 1 & 0 & & 0 & 0 \\ 0 & 0 & 0 & 1 & & & 0 & 0 \\ 0 & 0 & 0 & 1 & & & 0 & 0 \\ C_K & C_{K-1} & C_{K-2} & C_{K-3} & & & C_{1} & 1 \\ 0 & 0 & 0 & 0 & & & & 1 \end{bmatrix} \begin{bmatrix} F_0 \\ F_1 \\ F_2 \\ F_3 \\ F_K \end{bmatrix} = \begin{bmatrix} F_1 \\ F_2 \\ F_3 \\ F_K \end{bmatrix} \\ \begin{bmatrix} F_1 \\ F_2 \\ F_3 \\ \end{bmatrix} = \begin{bmatrix} F_1 \\ F_2 \\ F_3 \\ \end{bmatrix} \begin{bmatrix} F_1 \\ F_2 \\ F_3 \\ \end{bmatrix} = \begin{bmatrix} F_1 \\ F_2 \\ F_3 \\ \end{bmatrix} \begin{bmatrix} F_1 \\ F_2 \\ F_3 \\ \end{bmatrix} = \begin{bmatrix} F_1 \\ F_2 \\ F_3 \\ \end{bmatrix} \begin{bmatrix} F_1 \\ F_2 \\ F_3 \\ \end{bmatrix} = \begin{bmatrix} F_1 \\ F_2 \\ F_3 \\ \end{bmatrix} \begin{bmatrix} F_1 \\ F_2 \\ \end{bmatrix} \begin{bmatrix} F_1$$

6.6 Game Theory

A game can be reduced to Nim if it is a finite impartial game. Nim and its variants include:

6.6.1 Nim

Let $X = \bigoplus_{i=1}^n x_i$, then $(x_i)_{i=1}^n$ is a winning position iff $X \neq 0$. Find a move by picking k such that $x_k > x_k \oplus X$.

6.6.2 Misère Nim

Regular Nim, except that the last player to move loses. Play regular Nim until there is only one pile of size larger than 1, reduce it to 0 or 1 such that there is an odd number of piles. The second player wins (a_1, \ldots, a_n) if 1) there is a pile $a_i > 1$ and $\bigoplus_{i=1}^{n} a_i = 0 \text{ or } 2$) all $a_i \leq 1$ and $\bigoplus_{i=1}^{n} a_i = 1$.

6.6.3 Staircase Nim

Stones are moved down a staircase and only removed from the last pile. $(x_i)_{i=1}^n$ is an L-position if $(x_{2i-1})_{i=1}^{n/2}$ is (i.e. only look at odd-numbered piles).

nim-product.h

Description: Product of nimbers is associative, commutative, and distributive over addition (xor). Forms finite field of size 2^{2^k} . Application: Given 1D coin turning games $G_1, G_2, G_1 \times G_2$ is the 2D coin turning game defined as follows. If turning coins at x_1, x_2, \ldots, x_m is legal in G_1 and y_1, y_2, \ldots, y_n is legal in G_2 , then turning coins at all positions (x_i, y_i) is legal assuming that the coin at (x_m, y_n) goes from heads to tails. Then the grundy function g(x, y) of $G_1 \times G_2$ is $g_1(x) \times g_2(y)$.

Time: 64^2 xors per multiplication, memorize to speed up. f55947, 24 lines

```
ull nim_prod[64][64];
ull nim_prod2(int i, int j) { // hash-1
 if (nim prod[i][j]) return nim prod[i][j];
 if ((i & j) == 0) return nim_prod[i][j] = 1ull << (i|j);</pre>
 int a = (i\&j) \& -(i\&j);
 return nim_prod[i][j] = nim_prod2(i ^ a, j) ^ nim_prod2((i ^
       a) | (a-1), (j^a) | (i & (a-1));
\frac{1}{100} / \frac{1}{100} hash - 1 = 65b711
void all_nim_prod() { // hash-2
 for (int i = 0; i < 64; i++)
    for (int j = 0; j < 64; j++)
      if ((i & j) == 0) nim_prod[i][j] = 1ull << (i|j);</pre>
      else {
```

```
int a = (i\&j) \& -(i\&j);
        nim_prod[i][j] = nim_prod[i ^ a][j] ^ nim_prod[(i ^ a)
              | (a-1)][(j ^ a) | (i & (a-1))];
\frac{1}{hash-2} = f46d0f
ull get_nim_prod(ull x, ull y) { // hash-3
 ull res = 0;
 for (int i = 0; i < 64 \&\& (x >> i); ++i)
    if ((x >> i) & 1)
      for (int j = 0; j < 64 && (y >> j); ++j)
        if ((y >> j) & 1) res ^= nim_prod2(i, j);
  return res;
\frac{1}{2} / \frac{1}{2} hash - 3 = c5b053
```

Graph (7)

7.1 Fundamentals

euler-walk.h

Description: Eulerian undirected/directed path/cycle algorithm. Input should be a vector of (dest, global edge index), where for undirected graphs, forward/backward edges have the same index. Returns a list of nodes in the Eulerian path/cycle with src at both start and end, or empty list if no cycle/path exists. To get edge indices back, add .second to s and ret.

```
Time: \mathcal{O}(V+E)
vector<int> eulerWalk(vector<vector<pii>>& gr, int nedges, int
    src=0) {
  int n = gr.size();
  vector<int> D(n), its(n), eu(nedges), ret, s = {src};
 D[src]++; // to allow Euler paths, not just cycles
  while (!s.empty()) { // hash-1
    int x = s.back(), y, e, &it = its[x], end = int(gr[x].size
    if (it == end) { ret.push_back(x); s.pop_back(); continue; }
    tie(y, e) = qr[x][it++];
    if (!eu[e])
      D[x]--, D[y]++, eu[e] = 1, s.push back(y);
  \frac{1}{hash-1} = f50118
  for (auto &x : D) if (x < 0 \mid | int(ret.size()) != nedges+1)
       return {};
  return {ret.rbegin(), ret.rend()};
```

7.2 DFS algorithms

tarjan.h

Description: Finds all strongly connected components in a directed graph. Usage: $sc_t s(q)$; $s.solve([&](const vector < int > & cc) {...});$ visits all components in reverse topological order. Time: $\mathcal{O}\left(E+V\right)$

```
struct scc_t {
    int n, t, scc_num;
    vector<vector<int>> adj;
    vector<int> low, id, stk, in_stk, cc_id;
    scc_t(const auto& q) : n(int(q.size())), t(0), scc_num(0),
    adj(g), low(n,-1), id(n,-1), in_stk(n, false), cc_id(n) {}
    template < class F > void dfs (int cur, F f) { // hash-1
        id[cur] = low[cur] = t++;
        stk.push_back(cur); in_stk[cur] = true;
        for (int nxt : adj[cur])
            if (id[nxt] == -1)
                dfs(nxt, f), low[cur] = min(low[cur], low[nxt])
            else if (in_stk[nxt])
                low[cur] = min(low[cur], id[nxt]);
        if (low[cur] == id[cur]) {
            vector<int> cc; cc.reserve(stk.size());
```

bcc 2sat centroid-decomposition heavylight

```
while (true) {
    int v = stk.back(); stk.pop_back();
    in_stk[v] = false;
    cc.push_back(v); cc_id[v] = scc_num;
    if (v == cur) break;
    } f(cc); scc_num++;
} // hash-1 = b8aa46
template<class F> void solve(F f) {
    stk.reserve(n);
    for (int r = 0; r < n; ++r) if (id[r] == -1) dfs(r, f);
};</pre>
```

bcc.h

Description: Finds all biconnected components in an undirected graph. In a biconnected component there are at least two distinct paths between any two nodes or the component is a bridge. Note that a node can be in several components. blockcut constructs the block cut tree of given graph. The first nodes represents the blocks, the others represents the articulation points. Usage: int e.id = 0; vector<pair<int, int>> g(N);

```
for (auto [a,b] : edges) {
g[a].emplace_back(b, e_id);
g[b].emplace_back(a, e_id++); }
bcc_t b(q); b.solve([&](const vector<int>& edges_id) {...});
Time: \mathcal{O}(E+V)
                                                                                                                                                   f05480, 50 lines
struct bcc t {
           int n, t;
           vector<vector<pii>> adi;
           vector<int> low, id, stk, is art;
           bcc_t(const vector<vector<pii>>> &g) : n(int(g.size())),
           t(0), adj(q), low(n,-1), id(n,-1), is_art(n) {}
           template < class F > void dfs (int cur, int e par, F f) {
                      id[cur] = low[cur] = t++;
                      stk.push_back(e_par); int c = 0;
                      for (auto [nxt, e_id] : adj[cur]) {
                                  if (id[nxt] == -1) \{ // hash-1 \}
                                            dfs(nxt, e id, f);
                                            low[cur] = min(low[cur], low[nxt]); c++;
                                            if (low[nxt] < id[cur]) continue;</pre>
                                            is art[cur] = true;
                                            auto top =find(stk.rbegin(), stk.rend(), e_id);
                                            vector<int> cc(stk.rbegin(), next(top));
                                            f(cc); stk.resize(stk.size()-cc.size());
                                 else if (e_id != e_par) {
                                            low[cur] = min(low[cur], id[nxt]);
                                             if (id[nxt] < id[cur]) stk.push_back(e_id);</pre>
                                  \frac{1}{100} / \frac{1}{100} = \frac{1}
                      } if(e_par == -1) is_art[cur] = (c > 1) ? true : false;
           template<class F> void solve(F f) {
                      stk.reserve(n);
                      for (int r = 0; r < n; ++r) if (id[r] == -1) dfs(r,-1,f);
           auto blockcut(const vector<pii> &edges) {
                     vector<vector<int>> cc; vector<int> cc_id(n,-1);
                      solve([&](const vector<int> &c) { // hash-2
                                 set<int> vc;
                                  for(int e : c){
                                            auto [a, b] = edges[e];
                                            cc_id[a] = cc_id[b] = int(cc.size());
                                            vc.insert(a); vc.insert(b);
                                  } cc.emplace_back(vc.begin(), vc.end());
                      ); // hash-2 = 4e2783
                       for (int a = 0; a < n; a++) if (is_art[a])
                                  cc_id[a] = int(cc.size()), cc.push_back({a});
                      int bcc_num = int(cc.size()); // hash-3
```

```
vector<vector<int>> tree(bcc_num);
for(int c = 0; c < bcc_num && l<int(cc[c].size()); ++c)
    for(int a : cc[c]) if(is_art[a]) {
        tree[c].push_back(cc_id[a]);
        tree[cc_id[a]].push_back(c);
    } return make_tuple(cc_id, cc, tree);
} // hash-3 = 4b5ad9
;;</pre>
```

2sat.h

Description: Calculates a valid assignment to boolean variables a, b, c,... to a 2-SAT problem, so that an expression of the type (a|||b)&&(!a|||c)&&(d|||!b)&&... becomes true, or reports that it is unsatisfiable. Negated variables are represented by bit-inversions (-x).

```
Usage: TwoSat ts(number of boolean variables); ts.either(0, \sim3); // Var 0 is true or var 3 is false ts.set_value(2); // Var 2 is true ts.at_most_one({0, \sim1,2}); // <= 1 of vars 0, \sim1 and 2 are true ts.solve(); // Returns true iff it is solvable ts.values[0..N-1] holds the assigned values to the vars
```

Time: $\mathcal{O}(N+E)$, where N is the number of boolean variables, and E is the number of clauses.

```
"tarjan.h"
                                                                                                                                                                                    74e46b, 36 lines
struct TwoSat { // hash-1
             int N;
             vector<vector<int>> gr;
             vector<int> values; // 0 = false, 1 = true
             TwoSat(int n = 0) : N(n), gr(2*n) {}
             int add_var() { // (optional)
                           gr.emplace_back(); gr.emplace_back();
                            return N++;
              \frac{1}{100} / \frac{1}{100} = \frac{1}{100} cc + \frac{1}{100} ac + \frac{1}{100} 
              void either(int f, int j) { // hash-2
                            f = \max(2*f, -1-2*f); \dot{j} = \max(2*\dot{j}, -1-2*\dot{j});
                            gr[f].push_back(j^1); gr[j].push_back(f^1);
              h // hash = 2 = 516db0
             void implies(int f, int j) { either(~f, j); }
             void set_value(int x) { either(x, x); }
             void at most one(const vector<int>& li) { // (optional)
                           if (int(li.size()) <= 1) return;</pre>
                           int cur = \simli[0];
                           for (int i = 2; i < int(li.size()); ++i) {</pre>
                                         int next = add_var();
                                         either(cur, ~li[i]); either(cur, next);
                                         either(~li[i], next); cur = ~next;
                            } either(cur, ~li[1]);
             bool solve() { // hash-3
                          scc t s(gr);
                          s.solve([](const vector<int> &v) { return; } );
                          values.assign(N, -1);
                           for (int i = 0; i < N; ++i)
                                        if (s.cc_id[2*i] == s.cc_id[2*i+1]) return 0;
                           for (int i = 0; i < N; ++i)
                                         if (s.cc_id[2*i] < s.cc_id[2*i+1]) values[i] =
                                                         false:
                                         else values[i] = true;
                           return 1;
             \frac{1}{2} / \frac{1}{2} hash - 3 = 91930 f
};
```

7.3 Trees

centroid-decomposition.h

```
struct centroid_tree { // hash-1
int N;
vector<pair<int, int>> max_sub;
vector<vector<int>> dist, adj;
```

```
vector<int> depth, par;
 vector<bool> deleted:
 centroid tree(const auto& G) : N(G.size()), adj(G), depth(N),
    par(N,-1), deleted(N), dist(\underline{\underline{\hspace{0.5cm}}}lg(N)+1, vector(N,0)),
         max_sub(N) {
      rec(0, -1, 0);
    \frac{1}{100} / \frac{1}{100} hash-1 = 05eea5
 int dfs(int cur, int prv) { // hash-2
    int sz = 1;
    max\_sub[cur] = \{0, -1\};
    for (int nxt : adj[cur]) {
      if (nxt == prv || deleted[nxt]) continue;
      int cur_sz = dfs(nxt, cur);
      sz += cur_sz;
      max_sub[cur] = max(max_sub[cur], {cur_sz, nxt});
    return sz;
 \frac{1}{hash-2} = 57a49c
 void layer(int cur, int prv, int lvl) { // hash-3
    for (int nxt : adj[cur]) {
      if (nxt == prv || deleted[nxt]) continue;
      dist[lvl][nxt] = dist[lvl][cur] + 1;
      layer(nxt, cur, lvl);
 \frac{1}{100} / \frac{1}{100} hash - 3 = 6e1d27
 void rec(int cur, int prv, int d) { // hash-4
    int sz = dfs(cur, prv);
    while(max_sub[cur].first > sz/2) cur = max_sub[cur].second;
    depth[cur] = d;
    par[cur] = prv;
    layer(cur, prv, d);
    deleted[cur] = true;
    for (int nxt : adj[cur]) {
      if (deleted[nxt]) continue;
      rec(nxt, cur, d + 1);
 \frac{1}{hash-4} = 24f90d
};
```

heavylight h

Description: Compress Tree: Given a subset S of nodes, computes the compress tree and returns a list of edges representing a tree rooted at 0.

Time: $\mathcal{O}\left((\log N)^2\right)$

```
template<bool use_edges> struct hld_t {
 int N, T{};
 vector<vector<int>> adj;
 vector<int> sz, depth, chain, par, in, out, preorder;
 hld t() {}
 hld_t(const vector<vector<int>>& G, int r = 0) : N(int(G.size
      ())),
 adj(G), sz(N), depth(N), chain(N), par(N), in(N), out(N),
 preorder(N) { dfs_sz(r); chain[r] = r; dfs_hld(r); }
 void dfs_sz(int cur) { // hash-1
   sz[cur] = 1;
   for (auto& nxt : adj[cur]) {
     par[nxt] = cur; depth[nxt] = 1 + depth[cur];
     adj[nxt].erase(find(adj[nxt].begin(), adj[nxt].end(), cur
     dfs_sz(nxt); sz[cur] += sz[nxt];
     if (sz[nxt] > sz[adj[cur][0]]) swap(nxt, adj[cur][0]);
 \frac{1}{hash-1} = 87f84a
 void dfs_hld(int cur) { // hash-2
   in[cur] = T++; preorder[in[cur]] = cur;
   for (auto& nxt : adj[cur]) {
     chain[nxt] = (nxt == adj[cur][0] ? chain[cur] : nxt);
     dfs_hld(nxt);
    } out[cur] = T;
```

```
\frac{1}{2} / \frac{13a}{2} = \frac{13a}{2}
int lca(int a, int b) { // hash=3
 while (chain[a] != chain[b]) {
   if (in[a] < in[b]) swap(a, b);</pre>
   a = par[chain[a]];
  } return (in[a] < in[b] ? a : b);</pre>
\frac{1}{100} / \frac{1}{100} hash - 3 = 672231
bool is_ancestor(int a, int b) { return in[a] <= in[b] && in[</pre>
    b] < out[a]; }
int climb(int a, int k) { // hash-4
 if (depth[a] < k) return -1;
 int d = depth[a] - k;
 while (depth[chain[a]] > d) a = par[chain[a]];
  return preorder[in[a] - depth[a] + d];
\frac{1}{16} / \frac{1}{16} hash - \frac{1}{16} = \frac{268 fc4}{16}
int kth_on_path(int a, int b, int K) { // hash-5
 int m = lca(a, b);
  int x = depth[a] - depth[m], y = depth[b] - depth[m];
 if (K > x + y) return -1;
  return (x > K ? climb(a, K) : climb(b, x + y - K));
\frac{1}{2} / \frac{1}{2} hash - 5 = 34f729
// bool is true if path should be reversed (only for
     noncommutative operations)
const auto@ get_path(int a, int b) const { // hash-6
 static vector<tuple<bool, int, int>> L, R;
  L.clear(); R.clear();
 while (chain[a] != chain[b])
   if (depth[chain[a]] > depth[chain[b]]) {
      L.push_back({true, in[chain[a]], in[a] + 1});
      a = par[chain[a]];
     R.push_back({false, in[chain[b]], in[b] + 1});
      b = par[chain[b]];
  if (depth[a] > depth[b])
   L.push_back({true, in[b] + use_edges, in[a] + 1});
  else R.push_back({false, in[a] + use_edges, in[b] + 1});
 L.insert(L.end(), R.rbegin(), R.rend());
  return L:
\frac{1}{100} / \frac{1}{100} hash - 6 = 5b653a
auto get_subtree(int a) const {
  return make_pair(in[a] + use_edges, in[a] + sz[a]);
auto compress(vector<int> s){ // hash-7
  auto cmp = [&] (int a, int b) { return in[a] < in[b]; };</pre>
  sort(s.begin(), s.end(), cmp); int m = int(s.size())-1;
  for (int i = 0; i < m; ++i)
   s.push_back(lca(s[i], s[i+1]));
  sort(s.begin(), s.end(), cmp);
 s.erase(unique(s.begin(), s.end()), s.end());
  vector < pii > ret = { {0, s[0]} };
  for (int i = 0; i + 1 < int(s.size()); ++i)
   ret.emplace_back(lca(s[i], s[i+1]), s[i+1]);
  return ret:
h // hash - 7 = a035c4
```

tree-isomorphism.h

Time: $\mathcal{O}(N \log(N))$ a4f6c1, 38 lines

```
struct tree_t { // hash-1
  vector<int> cen, sz;
  vector<vector<int>> adj;
  tree_t (vector<vector<int>>& g):cen(2), sz(g.size()), adj(g) {}
  int dfs_sz(int v, int p) {
   sz[v] = 1;
   for (int u : adj[v]) if (u != p)
    sz[v] += dfs_sz(u, v);
    return sz[v];
```

```
\frac{1}{hash-1} = f1f64f
int dfs(int tsz, int v, int p) { // hash-2
  for (int u : adj[v]) if (u != p) {
    if (2*sz[u] <= tsz) continue;</pre>
    return dfs(tsz, u, v);
  } return cen[0] = v;
\frac{1}{100} / \frac{1}{100} hash-2 = d35be1
void find_cenroid(int v) { // hash-3
  int tsz = dfs_sz(v, -1);
  cen[1] = dfs(tsz, v, -1);
  for (int u : adj[cen[0]]) if (2*sz[u] == tsz)
    cen[1] = u;
\frac{1}{100} / \frac{1}{100} hash - 3 = 6d03ed
int hash_it(int v, int p = -1) { // hash-4
    static map<vector<int>, int> val;
  vector<int> offset;
  for (int u : adj[v]) if (u != p)
    offset.push_back(hash_it(u, v));
   sort(offset.begin(), offset.end());
  if (!val.count(offset)) val[offset] = int(val.size());
  return val[offset];
\frac{1}{hash-4} = f8d4d1
11 get_hash(int v = 0) { // hash-5
  find_cenroid(v);
  11 x = hash_it(cen[0]), y=hash_it(cen[1]);
  if (x > y) swap(x, y);
  return (x \ll 30) + y;
\frac{1}{100} / \frac{1}{100} hash-5 = 387158
```

7.4 Network flow

Description: Flow algorithm with complexity $O(VE \log U)$ where U =max |cap|. $O(\min(E^{1/2}, V^{2/3})E)$ if U = 1; $O(\sqrt{V}E)$ for bipartite matching. To obtain each partition A and B of the cut look at lvl, for $v \subset A$,

```
lvl[v] > 0, for u \subset B, lvl[u] = 0.
                                                      de8d6b, 44 lines
template<typename T = int> struct Dinitz { // hash-1
 struct edge t { int to, rev; T c, f; };
 vector<vector<edge_t>> adj;
 vector<int> lvl, ptr, q;
 Dinitz(int n) : lvl(n), ptr(n), q(n), adj(n) {}
 inline void addEdge(int a, int b, T c, T rcap = 0) {
    adj[a].push_back({b, (int)adj[b].size(), c, 0});
   adj[b].push_back({a, (int)adj[a].size() - 1, rcap, 0});
 \frac{1}{100} / \frac{1}{100} hash - 1 = 5a0d77
 T dfs(int v, int t, T f) { // hash-2
   if (v == t || !f) return f;
    for (int &i = ptr[v]; i < int(adj[v].size()); ++i) {</pre>
      edge_t &e = adj[v][i];
     if (lvl[e.to] == lvl[v] + 1)
       if (T p = dfs(e.to, t, min(f, e.c - e.f))) {
          e.f += p, adj[e.to][e.rev].f -= p;
          return p;
    } return 0;
 \frac{1}{2} / \frac{1}{2} = 8ffe6b
 T maxflow(int s, int t) { // hash-3
   T flow = 0; q[0] = s;
    for (int L = 0; L < 31; ++L) do { // consider L = 30
      lvl = ptr = vector<int>(q.size());
      int qi = 0, qe = lvl[s] = 1;
      while (qi < qe && !lvl[t]) {
       int v = q[qi++];
        for (edge_t &e : adj[v])
          if (!lvl[e.to] && (e.c - e.f) >> (30 - L))
            q[qe++] = e.to, lvl[e.to] = lvl[v] + 1;
      while(T p =dfs(s,t,numeric_limits<T>::max()/4)) flow+=p;
```

```
} while (lvl[t]);
                      return flow;
     \frac{1}{100} / \frac{1}{100} hash - 3 = db2141
   bool leftOfMinCut(int v) { return bool(lvl[v] != 0); }
   auto minCut(int s, int t) { // hash-4
                  T cost = maxflow(s,t);
                      vector<edge_t> cut;
                         for (int i = 0; i < int(adj.size()); i++) for(edge_t &e :</pre>
                                          if (lvl[i] && !lvl[e.to]) cut.push_back(e);
                         return make_pair(cost, cut);
\frac{1}{100} / \frac{1}{100} hash-4 = \frac{1}{100} \frac{1
```

min-cost-max-flow.h

```
Description: Min-cost max-flow. Assumes there is no negative cycle.
Time: \mathcal{O}(F(V+E)logV), being F the amount of flow.
template<class flow_t, class cost_t> struct min_cost {
 static constexpr flow_t FLOW_EPS = flow_t(1e-10);
  static constexpr flow t FLOW INF = numeric limits<flow t>::
  static constexpr cost t COST EPS = cost t(1e-10);
  static constexpr cost_t COST_INF = numeric_limits<cost_t>::
  int n, m{}; vector<int> ptr, nxt, zu;
  vector<flow_t> capa; vector<cost_t> cost;
  min cost(int N) : n(N), ptr(n,-1), dist(n), vis(n), pari(n) {}
  void add_edge(int u, int v, flow_t w, cost_t c) {
    nxt.push_back(ptr[u]); zu.push_back(v); capa.push_back(w);
         cost.push_back(c); ptr[u] = m++;
    nxt.push_back(ptr[v]); zu.push_back(u); capa.push_back(0);
         cost.push_back(-c); ptr[v] = m++;
  vector<cost t> pot. dist: vector<bool> vis: vector<int> pari;
  vector<flow_t> flows; vector<cost_t> slopes;
  // You can pass t = -1 to find a shortest
  void shortest (int s, int t) {//path to each vertex. // hash-1
    using E = pair<cost t, int>;
    priority_queue<E, vector<E>, greater<E>> que;
    for(int u = 0; u < n; ++u) {dist[u]=COST_INF; vis[u]=false;}</pre>
    for (que.emplace(dist[s] = 0, s); !que.empty(); ) {
      const cost_t c = que.top().first;
      const int u = que.top().second; que.pop();
      if (vis[u]) continue;
      vis[u] = true; if (u == t) return;
      for (int i = ptr[u]; ~i; i = nxt[i]) if (capa[i] >
          FLOW EPS) {
        const int v = zu[i];
        const cost_t cc = c + cost[i] + pot[u] - pot[v];
        if (dist[v] > cc) {que.emplace(dist[v]=cc,v);pari[v]=i;}
  \frac{1}{hash-1} = 89f16a
  auto run(int s, int t, flow_t limFlow = FLOW_INF) { // hash-2
    pot.assign(n, 0); flows = {0}; slopes.clear();
    while (true) {
      bool upd = false;
      for (int i = 0; i < m; ++i) if (capa[i] > FLOW EPS) {
        const int u = zu[i ^1], v = zu[i];
        const cost_t cc = pot[u] + cost[i];
        if(pot[v] > cc + COST_EPS) { pot[v] = cc; upd = true; }
      } if (!upd) break;
    flow_t flow = 0; cost_t tot_cost = 0;
    while (flow < limFlow) {
      shortest(s, t); flow_t f = limFlow - flow;
      if (!vis[t]) break;
      for (int u = 0; u < n; ++u) pot [u] += min(dist[u], dist[t]);
```

```
for (int v = t; v != s; ) { const int i = pari[v];
    if (f > capa[i]) { f = capa[i]; } v = zu[i^1];
}
for (int v = t; v != s; ) { const int i = pari[v];
    capa[i] -= f; capa[i^1] += f; v = zu[i^1];
}
flow += f; tot_cost += f * (pot[t] - pot[s]);
flows.push_back(flow); slopes.push_back(pot[t] - pot[s]);
} return make_pair(flow, tot_cost);
} // hash-2 = 285527;
```

7.5 Matching

hopcroft-karp.h

Description: Fast bipartite matching algorithm. Graph g should be a list of neighbors of the left partition, and btoa should be a vector full of -1's of the same size as the right partition. Returns the size of the matching. btoa[i] will be the match for vertex i on the right side, or -1 if it's not matched. Usage: vector<int> btoa(m, -1); hoperoftKarp(q, btoa);

Time: $\mathcal{O}\left(\sqrt{V}E\right)$

d9a55d, 35 lines

```
using vi = vector<int>;
bool dfs(int a, int L, const vector<vi> &q, vi &btoa, vi &A, vi
     &B) { // hash-1
  if (A[a] != L) return 0;
 A[a] = -1;
  for(auto &b : g[a]) if (B[b] == L + 1) {
   B[b] = 0;
   if (btoa[b] == -1 || dfs(btoa[b], L+1, q, btoa, A, B))
     return btoa[b] = a, 1;
 return 0;
\frac{1}{2} / \frac{1}{2} hash - 1 = 2beb8d
int hopcroftKarp(const vector<vi> &g, vi &btoa) { // hash-2
 int res = 0;
  vector<int> A(g.size()), B(int(btoa.size())), cur, next;
  for (;;) {
   fill(A.begin(), A.end(), 0), fill(B.begin(), B.end(), 0);
   cur.clear();
   for (auto &a : btoa) if (a !=-1) A[a] = -1;
    for (int a = 0; a < g.size(); ++a) if (A[a] == 0) cur.
        push_back(a);
    for (int lay = 1;; ++lay) {
     bool islast = 0; next.clear();
     for(auto &a : cur) for(auto &b : q[a]) {
       if (btoa[b] == -1) B[b] = lay, islast = 1;
       else if (btoa[b] != a && !B[b])
          B[b] = lay, next.push_back(btoa[b]);
     if (islast) break;
     if (next.empty()) return res;
     for(auto &a : next) A[a] = lay;
     cur.swap(next);
    for(int a = 0; a < int(g.size()); ++a)
     res += dfs(a, 0, q, btoa, A, B);
\frac{1}{2} // hash-2 = ea37fa
```

bipartite-matching.h

Description: Fast Kuhn! Simple maximum cardinality bipartite matching algorithm. Better than hopcroftKarp in practice. Worst case is O(VE) on an hairy tree. Shuffling the edges and vertices ordering should break some worst-case inputs.

Time: $\Omega(VE)$

1b4d72, 31 lines

```
struct bm_t {
  int N, M, T;
```

```
vector<vector<int>> adi;
vector<int> match, seen;
bm t(int a, int b) : N(a), M(a+b), T(0), adj(M),
match(M, -1), seen(M, -1) {}
void add_edge(int a, int b) { adj[a].push_back(b + N); }
bool dfs(int cur) { // hash-1
  if (seen[cur] == T) return false;
  seen[cur] = T;
  for (int nxt : adj[cur]) if (match[nxt] == -1) {
    match[nxt] = cur, match[cur] = nxt;
    return true;
  for (int nxt : adj[cur]) if (dfs(match[nxt])) {
    match[nxt] = cur, match[cur] = nxt;
    return true;
  return false;
\frac{1}{100} / \frac{1}{100} hash-1 = 85af97
int solve() { // hash-2
  int res = 0;
  for (int cur = 1; cur; ) {
    cur = 0; ++T;
    for (int i = 0; i < N; ++i) if (match[i] == -1)
      cur += dfs(i);
    res += cur;
  return res;
\frac{1}{16} / \frac{1}{16} hash - 2 = ff \frac{3448}{16}
```

weighted-matching.h

Description: Given a weighted bipartite graph, matches every node on the left with a node on the right such that no nodes are in two matchings and the sum of the edge weights is minimal. Takes cost[N][M], where cost[i][j] = cost for L[i] to be matched with R[j] and returns (min cost, match), where L[i] is matched with R[match[i]]. Negate costs for max cost.

```
Time: \mathcal{O}(N^2M)
                                                       f0ea90, 28 lines
pair<int, vector<int>> hungarian(const vector<vector<int>> &a) {
 if (a.emptv()) return {0, {}};
 int n = a.size() + 1, m = a[0].size() + 1;
 vector < int > u(n), v(m), p(m), ans(n-1);
 for (int i = 1; i < n; ++i) { // hash-1
    p[0] = i; int j0 = 0; // add "dummy" worker 0
    vector<int> dist(m, INT MAX), pre(m, -1);
    vector<bool> done(m + 1);
      done[j0] = true;
      int i0 = p[j0], j1, delta = INT_MAX;
      for(int j = 1; j < m; ++j) if (!done[j]) {
        auto cur = a[i0-1][j-1] - u[i0] - v[j];
        if (cur < dist[j]) dist[j] = cur, pre[j] = j0;</pre>
        if (dist[j] < delta) delta = dist[j], j1 = j;</pre>
      for (int j = 0; j < m; ++j)
        if (done[j]) u[p[j]] += delta, v[j] -= delta;
        else dist[j] -= delta;
      j0 = j1;
    } while (p[j0]);
    while (j0) { // update alternating path
      int j1 = pre[j0]; p[j0] = p[j1], j0 = j1;
  \frac{1}{2} / \frac{1}{2} hash - 1 = 6dbf35
 for (int j = 1; j < m; ++j) if (p[j]) ans [p[j]-1] = j-1;
 return {-v[0], ans}; // min cost
```

```
general-matching
```

Description: Maximum Matching for general graphs (undirected and non bipartite) using Edmond's Blossom Algorithm.

Time: $\mathcal{O}\left(EV^{\overline{2}}\right)$

e5db8e, 47 lines

```
struct blossom_t { // hash-1
 int N, M; vector<vector<int>> adj;
 vector<int> match, ts, ps; vector<array<int, 2>> fs;
 blossom_t(auto& G) : N(int(G.size())), M(0), adj(G), match(N
       (-1), ts(N,-1), ps(N,-1), fs(N,\{-1,-1\}) {}
  int root(int a) {
    return (ts[a] != M || !~ps[a]) ? a : (ps[a] = root(ps[a]));
  \frac{1}{2} // hash-1 = abfc73
 void rematch (int a, int b) { // hash-2
    const int w = match[a]; match[a] = b; auto [x, y] = fs[a];
    if (\sim w \&\& match[w] == a) {
      if (\sim v) rematch (x, v), rematch (v, x);
      else match[w] = x, rematch(x, w);
 \frac{1}{hash-2} = b389e7
 bool augment (int src) { // hash-3
    vector<int> bfs = {src}; bfs.reserve(N);
    ts[src] = M; ps[src] = -1; fs[src] = \{-1, -1\};
    for (int z = 0; z < int(bfs.size()); ++z) {
      int cur = bfs[z];
      for (int nxt : adj[cur]) if (nxt != src) {
        if (match[nxt] == -1) {
          match[nxt] = cur; rematch(cur, nxt); return true;
        if (ts[nxt] == M) {
          int a = root(cur), b = root(nxt), m = src;
          if (a == b) continue;
          while (a != src || b != src) {
            if (b != src) swap(a, b);
            if (fs[a][0]==cur&&fs[a][1]==nxt) { m = a; break; }
            fs[a] = \{cur, nxt\}; a = root(fs[match[a]][0]);
          for (const int r : {root(cur), root(nxt)})
            for (int v = r; v != m; v = root(fs[match[v]][0]))
              ts[v] = M, ps[v] = m, bfs.push_back(v);
        } else if (ts[match[nxt]] != M) {
          fs[nxt] = \{-1, -1\}; ts[match[nxt]] = M;
          ps[match[nxt]] = nxt; fs[match[nxt]] = {cur, -1};
          bfs.push_back(match[nxt]);
    } return false;
  \frac{1}{2} / \frac{1}{2} hash - 3 = e^{2482c}
 int run() {
    for (int v = 0; v < N; ++v) if (!~match[v]) M += augment(v);
    return M;
```

max-independent-set.h

Description: To obtain a maximum independent set of a graph, find a max clique of the complement. If the graph is bipartite, see MinimumVertex-Cover.

7.6 Heuristics

maximal-cliques.h

Description: Runs a callback for all maximal cliques in a graph (given as a symmetric bitset matrix; self-edges not allowed). Possible optimization: on the top-most recursion level, ignore 'cands', and go through nodes in order of increasing degree, where degrees go down as nodes are removed.

Time: $\mathcal{O}\left(3^{n/3}\right)$, much faster for sparse graphs

57e107, 11 lines

```
typedef bitset<128> B;
template<class F>
void cliques(vector<B> &eds, F f, B P = \simB(), B X={}, B R={}) {
 if (!P.any()) { if (!X.any()) f(R); return; }
  auto q = (P | X)._Find_first();
  auto cands = P & ~eds[q];
  for(int i = 0; i < eds.size(); ++i) if (cands[i]) {</pre>
   R[i] = 1; cliques(eds, f, P & eds[i], X & eds[i], R);
   R[i] = P[i] = 0; X[i] = 1;
```

chromatic-number.h

Description: Compute the chromatic number of a graph. Minimum number of colors needed to paint the graph in a way s.t. if two vertices share an edge, they must have distinct colors.

```
Time: \mathcal{O}\left(N2^N\right)
```

```
dd49e4, 26 lines
template<class T> int min_colors(int N, const T& gr) {
  vector<int> adj(N);
  for (int a = 0; a < N; ++a) // hash-1
    for (int b = a + 1; b < N; ++b) {
      if (!gr[a][b]) continue;
      adj[a] = (1 << b); adj[b] = (1 << a);
    \frac{1}{100} / \frac{1}{100} hash - 1 = 1612da
  static vector<unsigned> dp(1 << N), buf(1 << N), w(1 << N);
  for (int mask = 0; mask < (1 << N); ++mask) { // hash-2
   bool ok = true;
    for (int i = 0; i < N; ++i) if (mask & 1 << i)
     if (adj[i] & mask) ok = false;
    if (ok) dp[mask]++;
   buf[mask] = 1;
   w[mask] = __builtin_popcount(mask) % 2 == N % 2 ? 1 : -1;
  \frac{1}{hash-2} = 4efbee
  for (int i = 0; i < N; ++i) // hash-3
   for (int mask = 0; mask < (1 << N); ++mask)
      if (!(mask & 1 << i)) dp[mask^(1 << i)] += dp[mask];</pre>
  for (int colors = 1; colors <= N; ++colors) {
   unsigned S = 0:
    for (int mask = 0; mask < (1 << N); ++mask)
     S += (buf[mask] *= dp[mask]) * w[mask];
    if (S) return colors:
  } assert(false); // hash-3 = 1e2316
```

cycle-counting.h

Description: Counts 3 and 4 cycles

Time: $\mathcal{O}\left(E\sqrt{E}\right)$

1cf947, 31 lines

```
using vi = vector<int>;
int count_cycles(const vector<vi>& adj, const vi& deg) {
  const int N = int(adj.size());
 vi idx(N), loc(N); iota(idx.begin(), idx.end(), 0);
  sort(idx.begin(), idx.end(), [&](const int& a, const int& b)
      { return deg[a] < deg[b]; });
  for (int i = 0; i < N; ++i) loc[idx[i]] = i;
  vector<vi> gr(N);
  for (int a = 0; a < N; ++a) for (int b : adj[a])
   if (loc[a] < loc[b]) gr[a].push_back(b);</pre>
  int cycle3 = 0, cycle4 = 0; // hash-1
    vector<bool> seen(N, false);
    for (int a = 0; a < N; ++a) {
      for (int b : gr[a]) seen[b] = true;
      for (int b : gr[a]) for (int c : gr[b])
       if (seen[c]) cycle3 += 1;
      for (int b : gr[a]) seen[b] = false;
```

```
vi cnt(N);
  for (int a = 0; a < N; ++a) {
    for (int b : adj[a]) for (int c : gr[b])
      if (loc[a] < loc[c]) {</pre>
        cycle4 += cnt[c];
        cnt[c]++;
    for (int b : adj[a]) for (int c : gr[b]) cnt[c] = 0;
} return cycle3; // hash-1 = 586f3b
```

edge-coloring.h

Description: Given a simple, undirected graph with max degree D, computes a (D+1)-coloring of the edges such that no neighboring edges share a color. (D-coloring is NP-hard, but can be done for bipartite graphs by repeated matchings of max-degree nodes.)

```
Time: \mathcal{O}(NM)
vector<int> misra_gries(int N, vector<pair<int, int>> eds) {
 const int M = int(eds.size());
 vector < int > cc(N + 1), ret(M), fan(N), free(N), loc;
 for (auto e : eds) ++cc[e.first], ++cc[e.second];
 int u, v, ncols = *max element(cc.begin(), cc.end()) + 1;
 vector<vector<int>> adj(N, vi(ncols, -1)); // hash-1
 for (auto e : eds) {
   tie(u, v) = e; fan[0] = v; loc.assign(ncols, 0);
   int at = u, end = u, d, c = free[u], ind = 0, i = 0;
    while (d = free[v], !loc[d] \&\& (v = adj[u][d]) != -1)
     loc[d] = ++ind, cc[ind] = d, fan[ind] = v;
    cc[loc[d]] = c;
    for (int cd = d; at != -1; cd ^= c ^ d, at = adj[at][cd])
     swap(adj[at][cd], adj[end = at][cd ^ c ^ d]);
    while (adj[fan[i]][d] != -1) {
     int left = fan[i], right = fan[++i], e = cc[i];
     adj[u][e] = left; adj[left][e] = u;
     adj[right][e] = -1; free[right] = e;
    // hash-1 = ed5ec6
    adj[u][d] = fan[i]; adj[fan[i]][d] = u;
    for (int y : {fan[0], u, end})
      for (int& z = free[y] = 0; adj[y][z] != -1; z++);
 for (int i = 0; i < M; ++i)
   for (tie(u, v) = eds[i]; adj[u][ret[i]] != v;) ++ret[i];
 return ret:
```

7.7 Other

manhattan-mst.h

Description: Given N points, returns up to 4*N edges, which are guaranteed to contain a minimum spanning tree for the graph with edge weights w(p,q) = |p.x - q.x| + |p.y - q.y|. Edges are in the form (distance, src, dst). Use a standard MST algorithm on the result to find the final MST.

Time: $\mathcal{O}(NlogN)$

```
<dsu.h>
                                                    de8170, 24 lines
typedef Point<int> P;
pair<vector<array<int, 3>>, int> manhattanMST(vector<P> ps) {
 vector<int> id(ps.size()); iota(id.begin(), id.end(), 0);
 vector<array<int, 3>> edges; // hash-1
 for (int k = 0; k < 4; ++k) {
    sort(id.begin(), id.end(), [&](int i, int j) {
     return (ps[i]-ps[j]).x < (ps[j]-ps[i]).y;});
    map<int, int> sweep;
    for(auto& i : id) {
      for (auto it = sweep.lower_bound(-ps[i].y);
        it != sweep.end(); sweep.erase(it++)) {
```

```
int j = it->second; P d = ps[i] - ps[j];
      if (d.y > d.x) break;
      edges.push_back({d.y + d.x, i, j});
    \} sweep[-ps[i].y] = i;
  if (k \& 1) for (auto\& p : ps) p.x = -p.x;
  else for(auto& p : ps) swap(p.x, p.y);
\frac{1}{hash-1} = b02b12
sort(edges.begin(), edges.end());
UF uf(ps.size()); int cost = 0;
for (auto e: edges) if (uf.unite(e[1], e[2])) cost += e[0];
return {edges, cost};
```

directed-mst.h

Description: Edmonds' algorithm for finding the weight of the minimum spanning tree/arborescence of a directed graph, given a root node. If no MST exists, returns -1.

Time: $\mathcal{O}\left(E\log V\right)$

```
"../data-structures/dsu-rollback.h"
                                                                                                                                                b2f135, 56 lines
struct Edge { int a, b; ll w; };
struct Node
    Edge key; // hash-1
    Node *1, *r; ll delta;
    void prop() {
          kev.w += delta;
          if (1) 1->delta += delta;
          if (r) r->delta += delta;
           delta = 0;
    Edge top() { prop(); return key; }
Node *merge(Node *a, Node *b) {
    if (!a || !b) return a ?: b;
    a->prop(), b->prop();
    if (a->key.w > b->key.w) swap(a, b);
    swap(a->1, (a->r = merge(b, a->r)));
    return a:
 \frac{1}{1} / \frac{1}{1}  \frac{1}  \frac{1}{1}  \frac{
void pop(Node*& a) { a->prop(); a = merge(a->1, a->r); }
auto dmst(int n, int r, vector<Edge>& g) { // hash-2
    RollbackUF uf(n);
    vector<Node*> heap(n);
    for (Edge e : q) heap[e.b] = merge(heap[e.b], new Node{e});
     vector<int> seen(n, -1), path(n), par(n);
     seen[r] = r;
     vector<Edge> Q(n), in(n, \{-1,-1\}), comp;
     deque<tuple<int, int, vector<Edge>>> cycs;
     for (int s = 0; s < n; ++s) {
          int u = s, qi = 0, w;
           while (seen[u] < 0) {
                if (!heap[u]) return make_pair(-1L, vector<int>());
                Edge e = heap[u]->top();
                heap[u]->delta -= e.w, pop(heap[u]);
                Q[qi] = e, path[qi++] = u, seen[u] = s;
                res += e.w, u = uf.find(e.a);
                if (seen[u] == s) {
                     Node * cvc = 0;
                     int end = qi, time = uf.time();
                     do cyc = merge(cyc, heap[w = path[--qi]]);
                     while (uf.unite(u, w));
                     u = uf.find(u), heap[u] = cyc, seen[u] = -1;
                      cycs.push_front({u, time, {&Q[qi], &Q[end]}});
           for (int i = 0; i < qi; ++i) in [uf.find(Q[i].b)] = Q[i];
     for (auto& [u,t,comp] : cycs) { // restore sol (optional)
```

```
uf.rollback(t); Edge inEdge = in[u];
    for (auto& e : comp) in[uf.find(e.b)] = e;
   in[uf.find(inEdge.b)] = inEdge;
  for(int i = 0; i < n; ++i) par[i] = in[i].a;
 return make_pair(res, par);
\frac{1}{hash-2} = 222439
```

Theorems

7.8.1 Euler's theorem

Let V, A and F be the number of vertices, edges and faces of connected planar graph, V - A + F = 2.

7.8.2 Konig's theorem

In any bipartite graph the following holds: Maximum matching and minimum vertex cover have the same cardinality. Minimum edge cover, minimum path cover and maximum independent set have the same cardinality N - |M|.

7.8.3 Construct minimum vertex cover from maximum matching on bipartite graph

- 1. Redirect every edge: $y \to x$ if $(x, y) \in M$, $x \to y$ otherwise.
- 2. DFS from unmatched vertices in X.
- 3. $x \in X$ is chosen iff x is unvisited.
- 4. $y \in Y$ is chosen iff y is visited.

7.8.4 Minimum weight edge cover

- 1. For each $v \in V$ create a copy v', and connect $u' \to v'$ with weight w(u, v).
- 2. Connect $v \to v'$ with weight $2\mu(v)$, where $\mu(v)$ is the cost of the cheapest edge incident to v.
- 3. Find the minimum weight perfect matching on G'.

7.8.5 Maximum/Minimum flow with lower bound / Circulation problem

- 1. Construct super source S and sink T.
- 2. For each edge (x, y, l, u), connect $x \to y$ with capacity u l.
- 3. For each vertex v, denote by in(v) the difference between the sum of incoming lower bounds and the sum of outgoing lower bounds.
- 4. If in(v) > 0, connect $S \to v$ with capacity in(v), otherwise, connect $v \to T$ with capacity -in(v).
 - To maximize, connect $t \to s$ with capacity ∞ (skip this in circulation problem), and let f be the maximum flow from S to T. If $f \neq \sum_{v \in V, in(v) > 0} in(v)$, there's no solution. Otherwise, the maximum flow from s to t is the answer.
 - \bullet To minimize, let f be the maximum flow from S to T. Connect $t \to s$ with capacity ∞ and let the flow from S to T be f'. If $f + f' \neq \sum_{v \in V, in(v) > 0} in(v)$, there's no solution. Otherwise, f' is the answer.
- 5. The solution of each edge e is $l_e + f_e$, where f_e corresponds to the flow of edge e on the graph.

7.8.6 Minimum cost cyclic flow

1. Consruct super source S and sink T

- 2. For each edge (x, y, c), connect $x \to y$ with (cost, cap) = (c, 1) if c > 0, otherwise connect $y \to x$ with (cost, cap) = (-c, 1)
- 3. For each edge with c < 0, sum these cost as K, then increase d(y) by 1, decrease d(x) by 1
- 4. For each vertex v with d(v) > 0, connect $S \to v$ with (cost, cap) = (0, d(v))
- 5. For each vertex v with d(v) < 0, connect $v \to T$ with (cost, cap) = (0, -d(v))
- 6. Flow from S to T, the answer is the cost of the flow C + K

7.8.7 Maximum density induced subgraph

- 1. Binary search on answer, suppose we're checking answer T
- 2. Construct a max flow model, let K be the sum of all weights
- 3. Connect source $s \to v, v \in G$ with capacity K
- 4. For each edge (u, v, w) in G, connect $u \to v$ and $v \to u$ with capacity w
- 5. For $v \in G$, connect it with sink $v \to t$ with capacity $K+2T-(\textstyle\sum_{e\in E(v)}w(e))-2w(v)$ 6. T is a valid answer if the maximum flow f< K|V|

7.8.8 Project selection problem

- 1. If $p_v > 0$, create edge (s, v) with capacity p_v ; otherwise, create edge (v,t) with capacity $-p_v$.
- 2. Create edge (u, v) with capacity w with w being the cost of choosing u without choosing v.
- 3. The mincut is equivalent to the maximum profit of a subset of projects.

$7.8.9 \quad 0/1$ quadratic programming

$$\sum_{x} c_{x}x + \sum_{y} c_{y}\bar{y} + \sum_{xy} c_{xy}x\bar{y} + \sum_{xyx'y'} c_{xyx'y'}(x\bar{y} + x'\bar{y'})$$

can be minimized by the mincut of the following graph:

- 1. Create edge (x,t) with capacity c_x and create edge (s,y)with capacity c_{y} .
- 2. Create edge (x,y) with capacity c_{xy} .
- 3. Create edge (x,y) and edge (x',y') with capacity $c_{xyx'y'}$.

7.8.10 Eulerian Cycles

The number of Eulerian cycles in a directed graph G is: $t_w(G) \prod_{v \in G} (\deg v - 1)!$, where $t_w(G)$ is the number of arborescences ("directed spanning" tree) rooted at w (Check Number of Spanning Trees)

7.8.11 Number of Spanning Trees

Define Laplacian Matrix as L = D - A, D being a Diagonal Matrix with $D_{i,i} = indeg(i)$ and A an Adjacency Matrix. Create an $N \times N$ Laplacian matrix mat, and for each edge $a \to b \in G$, do mat[a][b]--, mat[b][b]++ (and mat[b][a]--, mat [a] [a] ++ if G is undirected). Remove the *i*th row and column and take the determinant; this yields the number of directed spanning trees rooted at i (if G is undirected, remove any row/column).

7.8.12 Tutte Matrix

- A graph has a perfect matching iff the *Tutte* matrix has a non-zero determinant.
- The rank of the *Tutte* matrix is equal to twice the size of the maximum matching. The maximum cost matching can be found by polynomial interpolation.

template $\langle \text{class T} \rangle$ int $\text{sgn}(\text{T x}) \{ \text{return } (x > 0) - (x < 0); \}$

Geometry (8)

8.1 Geometry

all-geometry.h

Description: Geometry 2D Library

template<class T> // hash-1

```
struct Point {
 typedef Point P;
 T x, v;
  explicit Point (T x=0, T y=0) : x(x), y(y) {}
  bool operator<(P p) const { return tie(x,y) < tie(p.x,p.y); }</pre>
  bool operator==(P p) const { return tie(x,y)==tie(p.x,p.y); }
 P operator+(P p) const { return P(x+p.x, y+p.y); }
 P operator-(P p) const { return P(x-p.x, y-p.y); }
 P operator*(T d) const { return P(x*d, y*d); }
 P operator/(T d) const { return P(x/d, y/d); }
 T dot(P p) const { return x*p.x + y*p.y; }
 T cross(P p) const { return x*p.y - y*p.x; }
 T cross(P a, P b) const { return (a-*this).cross(b-*this);
  T dist2() const { return x*x + y*y; }
  double dist() const { return sqrt((double)dist2()); }
  // angle to x-axis in interval [-pi, pi]
  double angle() const { return atan2(v, x); }
 P unit() const { return *this/dist(); } // makes dist()=1
  P perp() const { return P(-y, x); } // rotates +90 degrees
  P normal() const { return perp().unit(); }
  // returns point rotated 'a' radians ccw around the origin
 P rotate(double a) const {
    return P(x*cos(a)-y*sin(a),x*sin(a)+y*cos(a)); }
using P = Point<double>; // hash-1 = 96024b
// signed distance between point p and line (a, b)
template<class P> // hash-2
double lineDist(const P& a, const P& b, const P& p) {
 return (double) (b-a).cross(p-a)/(b-a).dist();
\frac{1}{hash-2} = f6bf6b
// shortest distance between point p and line segment (s, e)
double segDist(P& s, P& e, P& p) { // hash-3
 if (s==e) return (p-s).dist();
 auto d = (e-s) .dist2(), t = min(d, max(.0, (p-s).dot(e-s)));
 return ((p-s)*d-(e-s)*t).dist()/d;
\frac{1}{100} / \frac{1}{100} hash - 3 = ae751a
// intersection between two segments: Returns either the
// intersection point or the line segment (s,e)
// if there is infinitely many. Empty vector if no intersection
template<class P> // hash-4
vector<P> segInter(P a, P b, P c, P d) {
 auto oa = c.cross(d, a), ob = c.cross(d, b),
     oc = a.cross(b, c), od = a.cross(b, d);
  // Checks if intersection is single non-endpoint point.
 if (sgn(oa) * sgn(ob) < 0 && sgn(oc) * sgn(od) < 0)
    return { (a * ob - b * oa) / (ob - oa) };
 if (onSegment(c, d, a)) s.insert(a);
```

```
if (onSegment(c, d, b)) s.insert(b);
  if (onSegment(a, b, c)) s.insert(c);
  if (onSegment(a, b, d)) s.insert(d);
  return {s.begin(), s.end()};
\frac{1}{hash-4} = f6be16
// Same as above but returns only true or false
template<class P> // hash-5
bool segmentIntersectionQ(P s1, P e1, P s2, P e2) {
 if (e1 == s1) {
    if (e2 == s2) return e1 == e2;
    swap(s1,s2); swap(e1,e2);
  P v1 = e1-s1, v2 = e2-s2, d = s2-s1;
  auto a = v1.cross(v2), a1 = d.cross(v1), a2 = d.cross(v2);
  if (a == 0) { // parallel
    auto b1 = s1.dot(v1), c1 = e1.dot(v1),
       b2 = s2.dot(v1), c2 = e2.dot(v1);
    return !a1 && max(b1,min(b2,c2)) <= min(c1,max(b2,c2));
  if (a < 0) \{ a = -a; a1 = -a1; a2 = -a2; \}
  return (0 <= a1 && a1 <= a && 0 <= a2 && a2 <= a);
\frac{1}{2} // hash-5 = 1ff4ba
// {1, P} if there is a intersection, \{-1, (0,0)\} if
// there is infinitely, \{0,(0,0)\} otherwise.
template<class P> // hash-6
pair<int, P> lineInter(P s1, P e1, P s2, P e2) {
  auto d = (e1 - s1).cross(e2 - s2);
  if (d == 0) // if parallel
    return \{-(s1.cross(e1, s2) == 0), P(0, 0)\};
  auto p = s2.cross(e1, e2), q = s2.cross(e2, s1);
  return \{1, (s1 * p + e1 * q) / d\};
\frac{1}{100} / \frac{1}{100} hash - 6 = a01f81
// Projects point P onto line ab. Refl=true to get reflection
// of point P across line ab instead.
template<class P> // hash-7
P lineProj(P a, P b, P p, bool refl=false) {
 P v = b - a;
  return p - v.perp() * (1+refl) *v.cross(p-a) /v.dist2();
h // hash - 7 = b5562d
// 1/0/-1 \iff left/on line/right
template<class P> // hash-8
int sideOf(P s, P e, P p) { return sqn(s.cross(e, p)); }
template<class P>
int sideOf(const P& s, const P& e, const P& p, double eps) {
 auto a = (e-s).cross(p-s);
 double l = (e-s).dist()*eps;
 return (a > 1) - (a < -1);
\frac{1}{2} / \frac{1}{2} hash - 8 = 3 af 81 c
// True iff P lies on the line segment (s, e)
template<class P> bool onSegment(P s, P e, P p) { // hash-9
 return p.cross(s, e) == 0 \&\& (s - p).dot(e - p) <= 0;
\frac{1}{100} / \frac{1}{100} hash-9 = c597e8
// Linear transformation which takes line p0p1 to q0q1
P linearTransformation(const P& p0, const P& p1,
  const P& q0, const P& q1, const P& r) { // hash-10
  P dp = p1-p0, dq = q1-q0, num(dp.cross(dq), dp.dot(dq));
  return q0 + P((r-p0).cross(num), (r-p0).dot(num))/dp.dist2();
\frac{1}{100} / \frac{1}{100} = 45ea01
// Useful utilities for dealing with angles of rays from origin
template <class P> // hash-11
bool sameDir(P s, P t) {
  return s.cross(t) == 0 \&\& s.dot(t) > 0;
template <class P> // checks 180 <= s...t < 360?
bool isReflex(P s, P t) {
 auto c = s.cross(t);
  return c ? (c < 0) : (s.dot(t) < 0);
```

```
// operator < (s,t) for angles in [base,base+2pi)
template <class P>
bool angleCmp(P base, P s, P t) {
   int r = isReflex(base, s) - isReflex(base, t);
   return r ? (r < 0) : (0 < s.cross(t));
 // is x in [s,t] taken ccw? 1/0/-1 for in/border/out
template <class P>
int angleBetween(P s, P t, P x) {
   if (sameDir(x, s) || sameDir(x, t)) return 0;
   return angleCmp(s, x, t) ? 1 : -1; } // hash-11 = 6edd25
 // hash-12
int half (P p) { return p.y != 0 ? sgn(p.y) : -sgn(p.x); }
bool angle cmp(P a, P b) { int A = half(a), B = half(b);
   return A == B ? a.cross(b) > 0 : A < B; } // hash-12 = 9a6894
 // out is the pair of points at which two circles intersect
 // hash-13
bool circleInter(P a, P b, double r1, double r2, pair < P, P >* out) {
   if (a == b) { assert(r1 != r2); return false; }
   P \text{ vec} = b - a;
    double d2 = vec.dist2(), sum = r1+r2, dif = r1-r2,
               p = (d2 + r1*r1 - r2*r2)/(d2*2), h2 = r1*r1 - p*p*d2;
    if (sum*sum < d2 || dif*dif > d2) return false;
    P mid = a + vec*p, per = vec.perp() * sqrt(fmax(0, h2) / d2);
    *out = {mid + per, mid - per};
    return true;
 \frac{1}{2} / \frac{1}{2} = \frac{1}
 // Finds the external tangents of two circles, or internal if
// r2 is negated, .first and .second gives the tangency point
 // at circle 1 and 2 respec.
template<class P> // hash-14
vector<pair<P, P>> tangents(P c1, double r1, P c2, double r2) {
  P d = c2 - c1;
    double dr = r1 - r2, d2 = d.dist2(), h2 = d2 - dr * dr;
   if (d2 == 0 | | h2 < 0) return {};
    vector<pair<P, P>> out;
    for (double sign : {-1, 1}) {
        P v = (d * dr + d.perp() * sqrt(h2) * sign) / d2;
        out.push back(\{c1 + v * r1, c2 + v * r2\});
   if (h2 == 0) out.pop_back();
   return out;
 \frac{1}{2} / \frac{1}{2} hash - \frac{1}{4} = b0153d
 // radius of the circle going through points A, B and C
double ccRadius(const P& A, const P& B, const P& C) { // hash-15
    return (B-A).dist() * (C-B).dist() * (A-C).dist() /
         abs((B-A).cross(C-A))/2;
// Center of the circle above
P ccCenter(const P& A, const P& B, const P& C) {
   P b = C-A, c = B-A;
    return A + (b*c.dist2()-c*b.dist2()).perp()/b.cross(c)/2;
 h // hash-15 = c98102
 // min enclosing circle \sim O(N)
pair<P, double> mec(vector<P> ps) { // hash-16
    shuffle(ps.begin(),ps.end(), mt19937(time(0)));
    P \circ = ps[0];
    double r = 0, EPS = 1 + 1e-8;
    for (int i = 0; i < ps.size(); ++i)
        if ((o - ps[i]).dist() > r * EPS) {
            o = ps[i], r = 0;
             for (int j = 0; j < i; ++j) if ((o-ps[j]).dist()>r*EPS){
                o = (ps[i] + ps[i]) / 2;
                r = (o - ps[i]).dist();
                 for (int k = 0; k < j; ++k)
                     if ((o - ps[k]).dist() > r * EPS) {
                         o = ccCenter(ps[i], ps[j], ps[k]);
                          r = (o - ps[i]).dist();
```

```
return {o, r};
// hash-16 = 8ab87f
 // Intersection between circle and line ab, returns 0/1/2
          intersections
template<class P> // hash-17
vector<P> circleLine(P c, double r, P a, P b) {
    double h2 = r*r - a.cross(b,c)*a.cross(b,c)/(b-a).dist2();
    if (h2 < 0) return {};
    P p = lineProj(a, b, c), h = (b-a).unit() * sqrt(h2);
    if (h2 == 0) return {p};
    return \{p - h, p + h\};
 \frac{1}{100} / \frac{1}{100} hash-17 = debf86
template<class P>//intersection area of two circles // hash-18
double circleCircleArea(P c, double cr, P d, double dr) {
   if (cr < dr) swap(c, d), swap(cr, dr);
    auto A = [&] (double r, double h) {
        return r*r*acos(h/r)-h*sqrt(r*r-h*h);
    auto 1 = (c - d) \cdot dist(), a = (1*1 + cr*cr - dr*dr)/(2*1);
    if (1 - cr - dr >= 0) return 0; // far away
    if (1 - cr + dr <= 0) return M PI*dr*dr;
    if (1 - cr >= 0) return A(cr, a) + A(dr, 1-a);
    else return A(cr, a) + M_PI*dr*dr - A(dr, a-1);
 \frac{1}{100} / \frac{1}{100} hash - \frac{1}{100} = \frac{8bf2b6}{100}
 // area of intersection between a circle and a ccw polygon
#define arg(p, q) atan2(p.cross(q), p.dot(q)) // (conc or conv)
double circlePoly(P c, double r, vector<P> ps) { // hash-19
    auto tri = [&] (P p, P q) {
        auto r2 = r * r / 2;
        P d = q - p;
        auto a = d.dot(p)/d.dist2(), b = (p.dist2()-r*r)/d.dist2();
         auto det = a * a - b;
        if (det <= 0) return arg(p, q) * r2;
        auto s = max(0., -a-sqrt(det)), t = min(1., -a+sqrt(det));
        if (t < 0 \mid | 1 \le s) return arg(p, q) * r2;
        P u = p + d * s, v = p + d * t;
        return arg(p,u) * r2 + u.cross(v)/2 + arg(v,q) * r2;
    };
    auto sum = 0.0;
    for (int i = 0; i < ps.size(); ++i)
        sum += tri(ps[i] - c, ps[(i + 1) % ps.size()] - c);
    return sum;
\frac{1}{100} / \frac{1}{100} = \frac{1}
 // True if P lies within the polygon. If strict=true returns
// false for points on the boundary.
template<class P> // hash-20
bool inPolygon(vector<P> &p, P a, bool strict = true) {
    int cnt = 0, n = p.size();
    for (int i = 0; i < n; ++i) {
        P q = p[(i + 1) \% n];
         if (onSegment(p[i], q, a)) return !strict; // change to
                 //-1 if u need to detect points in the boundary
         //or: if (segDist(p[i], q, a) \le eps) return !strict;
        cnt ^= ((a.y<p[i].y) - (a.y<q.y)) * a.cross(p[i], q) > 0;
   return cnt;
\frac{1}{100} / \frac{1}{100} hash - 20 = f9442d
template<class T> // hash-21
T polygonArea(vector<Point<T>> &v) {
   T a = v.back().cross(v[0]);
    for (int i = 0; i < v.size()-1; ++i)
        a += v[i].cross(v[i+1]);
    return abs(a)/2.0;
\frac{1}{2} // hash-21 = 3bcaa4
Point<T> polygonCentroid(vector<Point<T>> &v) { // hash-22
    Point<T> cent(0,0); T area = 0;
    for(int i = 0; i < v.size(); ++i) {</pre>
```

```
int j = (i+1) % (v.size()); T a = cross(v[i], v[j]);
    cent += a * (v[i] + v[j]);
    area += a;
  return cent/area/(T)3;
\frac{1}{2} not tested!!! // hash-22 = 218bc9
// Center of mass of a polygon
P polygonCenter(const vector<P>& v) { // hash-23
 P res(0, 0); double A = 0;
  for (int i = 0, j = v.size() - 1; i < v.size(); j = ++i) {
    res = res + (v[i] + v[j]) * v[j].cross(v[i]);
   A += v[i].cross(v[i]);
 return res / A / 3;
\frac{1}{hash-23} = 26a00f
// Returns vertices of the polygon to the left of the cut (s,e)
vector<P> polygonCut(const vector<P>& poly, P s, P e) {
  vector<P> res; // hash-24
  for(int i = 0; i < poly.size(); ++i) {</pre>
   P cur = poly[i], prev = i ? poly[i-1] : poly.back();
    bool side = s.cross(e, cur) < 0;</pre>
    if (side != (s.cross(e, prev) < 0))
      res.push_back(lineInter(s, e, cur, prev).second);
    if (side) res.push_back(cur);
  return res;
\frac{1}{100} / \frac{1}{100} hash - \frac{24}{100} = \frac{120d5b}{100}
// no collinear points allowed
vector<P> convexHull(vector<P> pts) { // hash-25
  if (pts.size() <= 1) return pts;</pre>
  sort(pts.begin(), pts.end());
  vector<P> h(pts.size()+1);
  int s = 0, t = 0;
  for (int it = 2; it--; s = --t, reverse(pts.begin(), pts.end
    for (P p : pts) {
      while (t \ge s + 2 \&\& h[t-2].cross(h[t-1], p) \le 0) t--;
  return \{h.begin(), h.begin() + t - (t == 2 && h[0] == h[1])\};
h // hash - 25 = 3612d7
// Two points with the max distance on convex hull (ccw. no
array<P, 2> hullDiameter(vector<P> S) { // duplicate/collinear)
  int n = S.size(), j = n < 2 ? 0 : 1; // hash-26
  pair<lint, array<P, 2>> res({0, {S[0], S[0]}});
  for (int i = 0; i < j; ++i)
    for (;; j = (j + 1) % n) {
      res = \max(\text{res}, \{(S[i] - S[j]).dist2(), \{S[i], S[j]\}\});
      if ((S[(j+1) % n] - S[j]).cross(S[i+1] - S[i]) >= 0)
  return res.second;
\frac{1}{100} / \frac{1}{100} hash - 26 = a17dbf
// Checks whether P lies inside a convex hull.
bool inHull(const vector<P> &1, P p, bool strict = true) {
  int a = 1, b = 1.size() - 1, r = !strict; // hash-27
  if (1.size() < 3) return r && onSegment(1[0], 1.back(), p);</pre>
  if (sideOf(1[0], 1[a], 1[b]) > 0) swap(a, b);
  if (sideOf(1[0], 1[a], p) >= r || sideOf(1[0], 1[b], p) <= -r)
   return false:
  while (abs(a - b) > 1) {
    int c = (a + b) / 2;
    (sideOf(1[0], 1[c], p) > 0 ? b : a) = c;
  return sgn(l[a].cross(l[b], p)) < r;</pre>
\frac{1}{100} / \frac{1}{100} hash - 27 = d6ec66
// O(N+M) // hash-28
vector<P> minkowski_sum(vector<P> A, vector<P> B) {
 if (int(A.size()) > int(B.size())) swap(A, B);
```

```
if (A.empty()) return {};
 if (int(A.size()) == 1) {
    for (auto \& b : B) b = b + A.front();
    return B:
  rotate(A.begin(), min_element(A.begin(), A.end()), A.end());
  rotate(B.begin(), min element(B.begin(), B.end()), B.end());
 A.push_back(A[0]); A.push_back(A[1]);
 B.push_back(B[0]); B.push_back(B[1]);
  const int N = int(A.size()), M = int(B.size());
  vector<P> ans; ans.reserve(N+M);
 for (int i = 0, j = 0; i+2 < N \mid \mid j+2 < M;) {
    ans.push_back(A[i] + B[j]);
    auto sgn = (A[i+1] - A[i]).cross(B[j+1] - B[j]);
    i += (sgn >= 0); j += (sgn <= 0);
 return ans;
\frac{1}{100} / \frac{1}{100} hash - 28 = 71a25a
// Intersection between a line and a convex polygon (given ccw)
typedef array<P, 2> Line; // hash-29
#define cmp(i,j) sgn(dir.perp().cross(poly[(i)%n]-poly[(j)%n]))
#define extr(i) cmp(i + 1, i) >= 0 && cmp(i, i - 1 + n) < 0
int extrVertex(vector<P>& poly, P dir) {
 int n = poly.size(), left = 0, right = n;
 if (extr(0)) return 0;
 while (left + 1 < right) {
    int m = (left + right) / 2;
    if (extr(m)) return m;
    int ls = cmp(left + 1, left), ms = cmp(m + 1, m);
    (ls < ms \mid | (ls == ms \&\& ls == cmp(left, m)) ? right : left
 return left;
\frac{1}{100} / \frac{1}{100} hash-29 = d1d6b5
#define cmpL(i) sgn(line[0].cross(poly[i], line[1])) // hash-30
array<int, 2> lineHull(Line line, vector<P>& poly) {
 int endA = extrVertex(poly, (line[0] - line[1]).perp());
 int endB = extrVertex(poly, (line[1] - line[0]).perp());
 if (cmpL(endA) < 0 \mid | cmpL(endB) > 0)
    return {-1, -1};
  array<int, 2> res;
  for (int i = 0; i < 2; ++i) {
    int left = endB, right = endA, n = poly.size();
    while ((left + 1) % n != right) {
      int m = ((left + right + (left < right ? 0 : n)) / 2) % n
      (cmpL(m) == cmpL(endB) ? left : right) = m;
    res[i] = (left + !cmpL(right)) % n;
    swap (endA, endB);
 if (res[0] == res[1]) return {res[0], -1};
 if (!cmpL(res[0]) && !cmpL(res[1]))
    switch ((res[0] - res[1] + sz(poly) + 1) % poly.size()) {
      case 0: return {res[0], res[0]};
      case 2: return {res[1], res[1]};
 return res;
\frac{1}{100} / \frac{1}{100} = 324 dbc
// Halfplane intersection area
#define eps 1e-8
using P = Point < double >;
struct line_t { // hash-31
 P P1, P2;
 // Right hand side of the ray P1 -> P2
 explicit line_t(P a = P(), P b = P()) : P1(a), P2(b) \{\};
 P intpo(line_t y) {
    pair<int, P> r = lineInter(P1, P2, y.P1, y.P2);
```

```
assert(r.first == 1);
         return r.second:
    P dir() { return P2 - P1; }
    bool contains (P x) {
        return (P2 - P1).cross(x - P1) < eps;
    bool out(P x) { return !contains(x); }
 f(x) = \frac{1}{2} f(x) + \frac{1}{2} f(x)
bool mycmp(P a, P b) { // hash-32
    // return atan2(a.y, a.x) < atan2(b.y, b.x);
    if (a.x * b.x < 0) return a.x < 0;
    if (abs(a.x) < eps) {
         if (abs(b.x) < eps) return a.y > 0 && b.y < 0;
         if (b.x < 0) return a.y > 0;
         if (b.x > 0) return true;
    if (abs(b.x) < eps) {
         if (a.x < 0) return b.y < 0;
         if (a.x > 0) return false;
    return a.cross(b) > 0;
\frac{1}{100} / \frac{1}{100} hash - 32 = 71c36e
bool cmp(line_t a, line_t b) {return mycmp(a.dir(), b.dir());}
double intersection_area(vector<line_t> b) { // hash-33
    sort(b.begin(), b.end(), cmp);
    int n = int(b.size());
    int q = 1, h = 0, i;
    vector<line_t> c(b.size() + 10);
    for (i = 0; i < n; i++) {
         while (q < h \&\& b[i].out(c[h].intpo(c[h - 1]))) h--;
         while (q < h \&\& b[i].out(c[q].intpo(c[q + 1]))) q++;
         if (q < h \&\& abs(c[h].dir().cross(c[h-1].dir())) < eps) {
              if (c[h].dir().dot(c[h-1].dir()) > 0) {
                  if (b[i].out(c[h].P1)) c[h] = b[i];
                  // The area is either 0 or infinite. If you have a
                  // bounding box, then the area is definitely 0.
    while (q < h-1 \&\& c[q].out(c[h].intpo(c[h-1]))) h--;
    while (q < h-1 \&\& c[h].out(c[q].intpo(c[q + 1]))) q++;
    // Intersection is empty. This is sometimes different from
    // the case when the intersection area is 0.
    if (h - q <= 1) return 0;
    c[h + 1] = c[q];
    vector<P> s;
    for (i = q; i \le h; i++) s.push_back(c[i].intpo(c[i+1]));
    s.push back(s[0]);
    double ans = 0; int m = int(s.size());
    for (i = 0; i+1 < m; i++) ans += s[i].cross(s[i+1]);
    return ans/2:
 \frac{1}{100} / \frac{1}{100} hash - 33 = e9dda6
 // Closes pair of points. O(N logN)
pair<P, P> closest (vector<P> v) { // hash-34
    assert(v.size() > 1);
    sort(v.begin(), v.end(), [](Pa, Pb) { return a.y < b.y; });
    pair<int64_t, pair<P, P>> ret{LLONG_MAX, {P(), P()}};
    int j = 0;
    for(P &p : v) {
         P d{1 + (int64_t)sqrt(ret.first), 0};
         while (v[j].y \le p.y - d.x) S.erase(v[j++]);
         auto lo = S.lower_bound(p - d), hi = S.upper_bound(p + d);
         for (; lo != hi; ++lo)
```

```
ret = min(ret, {(*lo - p).dist2(), {*lo, p}});
   S.insert(p);
 return ret.second;
\frac{1}{2} / \frac{1}{2} hash - \frac{34}{2} = \frac{32b14f}{2}
// Rectangle union area
\verb|struct seg_node|{} // | hash-35|
 int val, cnt, lz;
  seg_node(int n = INF, int c = 0): val(n), cnt(c), lz(0) {}
  void push(seq_node& 1, seq_node& r) {
   if(lz){
     1.add(lz); r.add(lz); lz = 0;
  void merge(const seg_node& 1, const seg_node& r) {
   if(1.val < r.val) val = 1.val, cnt = 1.cnt;</pre>
    else if(1.val > r.val) val = r.val, cnt = r.cnt;
   else val = 1.val, cnt = 1.cnt + r.cnt;
  void add(int n) {
    val += n; lz += n;
  int get sum() { return (val ? 0 : cnt); }
// x1 y1 x2 y2
lint solve(const vector<array<int, 4>>&v){
  vector<int>ys;
  for(auto& [a, b, c, d] : v) {
   ys.push_back(b); ys.push_back(d);
  sort(ys.begin(), ys.end());
  ys.erase(unique(ys.begin(), ys.end()), ys.end());
  vector<array<int, 4>>e;
  for(auto [a, b, c, d] : v) {
   b = int(lower_bound(ys.begin(), ys.end(), b) - ys.begin());
   d = int(lower_bound(ys.begin(), ys.end(), d) - ys.begin());
    e.push_back({a, b, d, 1}); e.push_back({c, b, d, -1});
  sort(e.begin(), e.end()); int m = (int)ys.size();
  segtree_range<seg_node>seg(m-1);
  for(int i=0; i \le m-1; i++) seg.at(i) = seg_node(0, ys[i+1] - ys[i
      1);
  seg.build();
  int last = INT MIN, total = vs[m-1] - vs[0]; lint ans = 0;
  for(auto [x, y1, y2, c] : e) {
    ans += (lint) (total - seq.query(0, m-1).get_sum()) * (x -
    last = x; seg.update(y1, y2, &seg_node::add, c);
 return ans;
\frac{1}{2} / \frac{1}{2} hash - 35 = 276218
// Delaunay Triangulation. O(N^2). Each circumcircle contains
// none of the input points. If any three points are colinear
// or any four are on the same circle, behavior is undefined.
template<class P, class F> // hash-36
void delaunay (vector < P > & ps, F trifun) {
 if (ps.size() == 3) \{ int d=(ps[0].cross(ps[1], ps[2]) < 0); \}
   trifun(0,1+d,2-d); }
  vector<P3> p3;
  for(auto &p : ps) p3.emplace_back(p.x, p.y, p.dist2());
  if (ps.size()>3) for(auto &t: hull3d(p3)) if((p3[t.b]-p3[t.a
      cross(p3[t.c]-p3[t.a]).dot(P3(0,0,1)) < 0)
    trifun(t.a, t.c, t.b);
\frac{1}{100} / \frac{1}{100} hash - 36 = f6175a
// GEOMETRY 3D
template<class T> struct Point3D { // hash-37
 typedef Point3D P;
  typedef const P& R;
```

```
T x, y, z;
    explicit Point3D(T x=0, T y=0, T z=0) : x(x), y(y), z(z) {}
   bool operator<(R p) const {</pre>
        return tie(x, y, z) < tie(p.x, p.y, p.z); }
   bool operator==(R p) const {
        return tie(x, y, z) == tie(p.x, p.y, p.z); }
    P operator+(R p) const { return P(x+p.x, y+p.y, z+p.z); }
   P operator-(R p) const { return P(x-p.x, y-p.y, z-p.z); }
   P operator*(T d) const { return P(x*d, y*d, z*d); }
   P operator/(T d) const { return P(x/d, y/d, z/d); }
   T dot(R p) const { return x*p.x + y*p.y + z*p.z; }
   P cross(R p) const {
        return P(y*p.z - z*p.y, z*p.x - x*p.z, x*p.y - y*p.x);
   \frac{1}{100} / \frac{1}{100} hash - 37 = f914db
   T dist2() const { return x*x + y*y + z*z; } // hash-38
   double dist() const { return sqrt((double)dist2()); }
    //Azimuthal angle (longitude) to x-axis in interval [-pi, pi]
    double phi() const { return atan2(y, x); }
    //Zenith angle (latitude) to the z-axis in interval [0, pi]
    double theta() const { return atan2(sqrt(x*x+y*y),z); }
   P unit() const { return *this/(T)dist(); } //makes dist()=1
    //returns unit vector normal to *this and p
   P normal(P p) const { return cross(p).unit(); }
    //returns point rotated 'angle' radians ccw around axis
   P rotate(double angle, P axis) const {
        double s = sin(angle), c = cos(angle); P u = axis.unit();
         return u*dot(u)*(1-c) + (*this)*c - cross(u)*s;
f(x) = \frac{1}{2} \int \frac{1}{2} dx dx = \frac{1}{2} \int \frac{1}{2} \int \frac{1}{2} dx dx = \frac{1}{2} \int \frac{1}{2} dx dx = \frac{1}{2} \int \frac{1}{2} \int \frac{1}{2} \int \frac{1}{2} dx dx = \frac{1}{2} \int \frac
// polyhedron formula. Faces should point outwards.
template<class V, class L>
double signed_poly_volume(const V &p, const L &trilist) {
   double v = 0;
    for(auto &i : trilist) v += p[i.a].cross(p[i.b]).dot(p[i.c]);
   return v / 6:
// ConvexHull3D
typedef Point3D<double> P3;
struct PR { // hash-39
   void ins(int x) { (a == -1 ? a : b) = x; }
   void rem(int x) { (a == x ? a : b) = -1; }
   int cnt() { return (a !=-1) + (b !=-1); }
  int a, b;
\}; // hash-39 = cf7c9e
struct F { P3 q; int a, b, c; };
vector<F> hull3d(const vector<P3>& A) { // hash-40
    assert(A.size() >= 4);
    vector<vector<PR>> E(A.size(), vector<PR>(A.size(), {-1, -1})
              );
#define E(x,y) E[f.x][f.y]
   vector<F> FS;
   auto mf = [\&] (int i, int j, int k, int l) {
        P3 q = (A[j] - A[i]).cross((A[k] - A[i]));
        if (q.dot(A[1]) > q.dot(A[i]))
             q = q * -1;
        F f{q, i, j, k};
        E(a,b).ins(k); E(a,c).ins(j); E(b,c).ins(i);
        FS.push_back(f);
    for (int i=0; i<4; i++) for (int j=i+1; j<4; j++) for (k=j+1; k<4; k++)
        mf(i, j, k, 6 - i - j - k); // hash-40 = 80e001
    for(int i=4; i<A.size();++i) { // hash-41
         for(int j=0; j<FS.size(); ++j) {</pre>
             F f = FS[j];
             if(f.q.dot(A[i]) > f.q.dot(A[f.a])) {
                 E(a,b).rem(f.c);
                 E(a,c).rem(f.b);
                 E(b,c).rem(f.a);
                  swap(FS[j--], FS.back());
```

```
FS.pop_back();
   int nw = FS.size();
    for(int j=0; j<nw; j++) {</pre>
     F f = FS[j];
#define C(a, b, c) if (E(a,b).cnt() != 2) mf(f.a, f.b, i, f.c);
     C(a, b, c); C(a, c, b); C(b, c, a);
 for(auto &it: FS) if ((A[it.b] - A[it.a]).cross(
     A[it.c] - A[it.a]).dot(it.q) \ll 0) swap(it.c, it.b);
 return FS:
h: // hash-41 = 52653c
```

Strings (9)

kmp.h

Description: failure[x] computes the length of the longest prefix of s that ends at x, other than s[0...x] itself (abacaba -> -1,0,0,1,0,1,2,3). Can be used to find all occurrences of a pattern in a text.

Time: $\mathcal{O}(n)$

```
4eb73b, 9 lines
vector<int> prefix_function(const string& S) {
 vector<int> fail = {-1}; fail.reserve(S.size());
 for (int i = 0; i < int(S.size()); ++i) {
   int j = fail.back();
   while (j != -1 \&\& S[i] != S[j]) j = fail[j];
   fail.push back(i+1);
 return fail;
```

z-algorithm.h

Description: z[x] computes the length of the longest common prefix of s[i:]and s, except z[0] = 0. (abacaba -> 0010301) Time: $\mathcal{O}(n)$

```
7c8c64, 13 lines
vector<int> Z(const string& S) { // hash-1
 vector\langle int \rangle z(S.size()); int l = -1, r = -1;
 for(int i = 1; i < int(S.size()); ++i) {</pre>
    z[i] = i >= r ? 0 : min(r - i, z[i - 1]);
    while (i + z[i] < int(S.size()) && S[i + z[i]] == S[z[i]])
     z[i]++;
    if (i + z[i] > r) l = i, r = i + z[i];
 } return z;
\frac{1}{100} / \frac{1}{100} hash-1 = 049391
vector<int> get_prefix(string a, string b) {
 string str = a + '0' + b; vector<int> k = z(str);
 return vector<int>(k.begin() + int(a.size())+1, k.end());
```

manacher.h

Description: For each position in a string, computes p[0][i] = half length of longest even palindrome around pos i, p[1][i] = longest odd (half rounded down). Time: $\mathcal{O}(N)$

```
87e1f0, 12 lines
array<vector<int>, 2> manacher(const string &s) {
 int n = s.size();
 array<vector<int>, 2> p = {vector<int>(n+1), vector<int>(n)};
 for (int z = 0; z < 2; ++z) for (int i=0, 1=0, r=0; i < n; i++) {
   int t = r-i+!z;
   if (i<r) p[z][i] = min(t, p[z][1+t]);</pre>
    int L = i-p[z][i], R = i+p[z][i]-!z;
    while (L>=1 \&\& R+1< n \&\& s[L-1] == s[R+1])
      p[z][i]++, L--, R++;
    if (R > r) l = L, r = R;
```

rolling-hash.h

Description: Self-explanatory methods for string hashing. db642a, 36 lines

// Arithmetic mod 2^64-1. 2x slower than mod 2^64

```
typedef uint64_t ull;
struct H \{ // hash-1
  ull x; H(ull x=0) : x(x) {}
  H operator+(H o) { return x + o.x + (x + o.x < x); }
  H operator-(H o) { return *this + ~o.x; }
  H 	ext{ operator} * (H 	ext{ o}) { auto } m = (\underline{\underline{\quad}} uint128\underline{\quad} t) x * o.x;
   return H((ull)m) + (ull)(m >> 64); }
  ull get() const { return x + !~x; }
  bool operator==(H o) const { return get() == o.get(); }
  bool operator<(H o) const { return get() < o.get(); }</pre>
\}; // hash-1 = bf6be7
static const H C = (11)1e11+3; // (order ~ 3e9; random also ok)
struct HashInterval { // hash-2
  vector<H> ha, pw;
  HashInterval(string& str) : ha(int(str.size())+1), pw(ha) {
   pw[0] = 1;
    for(int i = 0; i < int(str.size()); ++i)</pre>
     ha[i+1] = ha[i] * C + str[i],
      pw[i+1] = pw[i] * C;
  H operator()(int a, int b) { // hash (a, b)
    return ha[b] - ha[a] * pw[b - a];
\}; // hash-2 = 2ddba2
vector<H> get_hashes(string& str, int length) { // hash-3
 if (int(str.size()) < length) return {};</pre>
  H h = 0, pw = 1;
  for(int i = 0; i < length; ++i)
   h = h * C + str[i], pw = pw * C;
  vector<H> ret = {h};
  for(int i = length; i < int(str.size()); ++i)</pre>
   ret.push_back(h = h * C + str[i] - pw * str[i-length]);
  return ret;
\frac{1}{2} / \frac{1}{2} hash - 3 = d21d2a
H hash_all(string& s){H h{}; for(char c:s) h=h*C+c; return h;}
```

aho-corasick.h

61f5e3, 36 lines

```
trie.push_back(init); out.push_back(-1);
                  cur = trie[cur][c];
        if (out[cur] == -1) out[cur] = i;
        ids[i] = out[cur];
\frac{1}{100} / \frac{1}{100} = \frac{1}{100} c = \frac{1}
vector<int> bfs, f(trie.size()); bfs.reserve(trie.size());
for (int c = 0; c < sigma; c++) // hash-2
       if (trie[0][c] == -1) trie[0][c] = 0;
       else bfs.push_back(trie[0][c]);
for (int z = 0; z < (int)bfs.size(); z++) {
        int cur = bfs[z];
       for (int c = 0; c < sigma; c++) {
                   if (trie[cur][c] == -1)
                             trie[cur][c] = trie[f[cur]][c];
                              int nxt = trie[cur][c];
                              int fail = trie[f[cur]][c];
                             if (out[nxt] == -1) out[nxt] = out[fail];
                              else parent[out[nxt]] = out[fail];
                              f[nxt] = fail; bfs.push_back(nxt);
\frac{1}{hash-2} = 2188a7
```

suffix-array.h

Description: Builds suffix array for a string, first element is the size of the string. The 1cp function calculates longest common prefixes for neighbouring strings in suffix array. The returned vector is of size n + 1.

Time: $\mathcal{O}(N \log N)$ where N is the length of the string for creation of the SA. $\mathcal{O}(N)$ for longest common prefixes.

```
<.../data-structures/rmq.h>, <.../various/random-numbers.h>
                                                     d31829, 66 lines
struct suffix array t { // hash-1
 int N, H; vector<int> sa, invsa, lcp;
 rmq_t<pair<int, int>> rmq;
 bool cmp(int a, int b) { return invsa[a+H] < invsa[b+H]; }</pre>
 void ternary_sort(int a, int b) {
   if (a == b) return;
   int md = sa[a+rng() % (b-a)], lo = a, hi = b;
   for (int i = a; i < b; ++i) if (cmp(sa[i], md))
     swap(sa[i], sa[lo++]);
    for (int i = b-1; i >= lo; --i) if (cmp(md, sa[i]))
     swap(sa[i], sa[--hi]);
   ternary_sort(a, lo);
   for (int i = lo; i < hi; ++i) invsa[sa[i]] = hi-1;</pre>
   if (hi-lo == 1) sa[lo] = -1;
   ternary_sort(hi, b);
 suffix_array_t() {} // hash-1 = 310a12
 template<typename I> // hash-2
 suffix_array_t(I begin, I end): N(int(end-begin)+1), sa(N) {
   vector<int> v(begin, end); v.push_back(INT_MIN);
   invsa = v; iota(sa.begin(), sa.end(), 0);
   H = 0; ternary_sort(0, N);
   for (H = 1; H \le N; H \ne 2) for (int j=0, i=j; i!=N; i=j)
       if (sa[i] < 0) {</pre>
         while (j < N \&\& sa[j] < 0) j += -sa[j];
         sa[i] = -(j - i);
        } else {j = invsa[sa[i]] + 1; ternary_sort(i, j);}
    for (int i = 0; i < N; ++i) sa[invsa[i]] = i;
   lcp.resize(N-1); int K = 0;
    for (int i = 0; i < N-1; ++i) {
     if(invsa[i] > 0) while (v[i+K] == v[sa[invsa[i]-1]+K])++K;
     lcp[invsa[i]-1] = K; K = max(K - 1, 0);
   vector<pair<int, int>> lcp_index(N-1);
   for (int i = 0; i < N-1; ++i) lcp_index[i] = {lcp[i], 1+i};
    rmq = rmq_t<pair<int, int>>(std::move(lcp_index));
```

```
\frac{1}{100} / \frac{1}{100} hash-2 = ef483d
         auto rmq_query(int a, int b) const {return rmq.query(a,b);}
         auto get_split(int a, int b) const {return rmq.query(a,b-1);}
         int get_lcp(int a, int b) const { // hash-3
                  if (a == b) return N - a;
                   a = invsa[a], b = invsa[b];
                   if (a > b) swap(a, b);
                  return rmq_query(a, b).first;
       \frac{1}{100} / \frac{1}{100} hash - 3 = 6877f0
};
vector<vector<int>> ch(2*N+1); int V = 0;
vector<array<int, 2>> sa_range(2*N+1);
vector<int> leaves(N+1), par(2*N+1), depth(2*N+1); // hash-4
auto dfs = [&] (auto&& self, int lo, int hi, int prv)-> void{
        int cur = V++; par[cur] = prv;
        if (prv != -1) ch[prv].push_back(cur);
        sa_range[cur] = {lo, hi};
        if (hi - lo == 1) {
                 leaves[us.sa[lo]] = cur;
                   depth[cur] = N-us.sa[lo] + 1;
                  int d = us.get_split(lo, hi).first;
                    depth[cur] = d; int mi = lo;
                   while (hi - mi >= 2) {
                            auto [nd, nmi] = us.get_split(mi, hi);
                             if (nd != d) break;
                             self(self, mi, nmi, cur); mi = nmi;
                    } self(self, mi, hi, cur);
f(s) = \frac{1}{2} \int_{-\infty}^{\infty} \frac{ds}{ds} \int_{-\infty}^{\infty} \frac{
```

suffix-automaton.h

Description: Suffix automaton

```
defb60, 33 lines
template<int offset = 'a'> struct array state { // hash-1
     array<int, 26> as;
      array_state() { fill(begin(as), end(as), \sim0); }
      int& operator[](char c) { return as[c - offset]; }
     int count(char c) { return (~as[c - offset] ? 1 : 0); }
h: // hash-1 = e60fd5
template<typename C, typename state = map<C, int>> struct
              suffix automaton { // hash-2
      struct node t {
            int len, link; int64 t cnt; state next;
      int N, cur; vector<node_t> nodes;
      suffix_automaton() : N(1), cur(0), nodes{node_t{0, -1, 0}},
                      {}}} {}
      node_t& operator[](int v) { return nodes[v]; };
      void append(C c) {
            int v = cur; cur = N++;
             nodes.push_back(node_t{nodes[v].len + 1, 0, 1, {}});
              for (; ~v && !nodes[v].next.count(c); v = nodes[v].link)
                   nodes[v].next[c] = cur;
             if (~v) {
                   const int u = nodes[v].next[c];
                    if (nodes[v].len + 1 == nodes[u].len) {
                         nodes[cur].link = u;
                   } else {
                          const int clone = N++;
                          nodes.push_back(nodes[u]);
                          nodes[clone].len = nodes[v].len + 1;
                          nodes[u].link = nodes[cur].link = clone;
                          for (; ~v && nodes[v].next[c] == u; v = nodes[v].link)
                                 nodes[v].next[c] = clone;
f(x) = \frac{1}{2} f(x) + \frac{1}{2} f(x)
```

9.1 Suffix Automaton

9.1.1 Number of different substrings

Is the number of paths in the automaton starting at the root. $d(v) = 1 + \sum_{v \to w} d(w)$

9.1.2 Total length of different substrings

Is the sum of children answers and paths starting at each children. $ans(v) = \sum_{v \to w} d(w) + ans(w)$

9.1.3 Lexicographically K-th substring

Is the K-th lexicographically path, so you can search using the number of paths from each state

9.1.4 Smallest cyclic shift

Construct for string S + S. Greedily search the minimal character.

9.1.5 Number of occurrences

For each state not created by cloning, initialize cnt(v) = 1. Then, just do a dfs to calculate cnt(v), with cnt(link(v)) + = cnt(v)

9.1.6 First occurrence position

When we create a new state cur do first(pos) = len(cur) - 1. When we clone q as clone do first(clone) = first(q). Answer is first(v) - size(P) + 1, where v is the state of string P

9.1.7 All occurrence positions

From first(v) do a dfs using suffix link, from link(u) go to u.

<u>Various</u> (10)

10.1 Intervals

interval-container.h

Description: Add and remove intervals from a set of disjoint intervals. Will merge the added interval with any overlapping intervals in the set when adding. Intervals are [inclusive, exclusive). Time: $\mathcal{O}(\log N)$

edce47, 20 lines set<pii>::iterator addInterval(set<pii> &is, int L, int R) { if (L == R) return is.end(); // hash-1auto it = is.lower_bound({L, R}), before = it; while (it != is.end() && it->first <= R) { R = max(R, it->second);before = it = is.erase(it); if (it != is.begin() && (--it)->second >= L) { L = min(L, it->first); R = max(R, it->second);is.erase(it); } return is.insert(before, {L,R}); $\frac{1}{2} / \frac{1}{2} hash - 1 = 52519d$ void removeInterval(set<pii> &is, int L, int R) { // hash-2 if (L == R) return; auto it = addInterval(is, L, R); auto r2 = it->second; if (it->first == L) is.erase(it); else (int&)it->second = L; if (R != r2) is.emplace (R, r2); $\frac{1}{2} / \frac{1}{2} = 0594c1$

interval-cover.h

Description: Compute indices of smallest set of intervals covering another interval. Intervals should be [inclusive, exclusive). To support [inclusive, inclusive], change (A) to add | | R.empty(). Returns empty set on failure (or if G is empty). Time: $\mathcal{O}(N \log N)$

```
template<class T>
vector<int> cover(pair<T, T> G, vector<pair<T, T>> I) {
 vector<int> S(I.size()), R;
 iota(S.begin(), S.end(), 0);
 sort(S.begin(), S.end(), [&](int a, int b) {
   return I[a] < I[b]; });
 T cur = G.first; int at = 0;
 while (cur < G.second) \{ // (A) \}
   pair<T, int> mx = \{cur, -1\};
   while (at < I.size() && I[S[at]].first <= cur) {
     mx = max(mx, {I[S[at]].second, S[at]});
   if (mx.second == -1) return {};
   cur = mx.first; R.push back(mx.second);
 } return R;
```

constant-intervals.h

Description: Split a monotone function on [from, to) into a minimal set of half-open intervals on which it has the same value. Runs a callback g for

Usage: constantIntervals(0, sz(v), [&](int x){

return v[x]; $\{ (int lo, int hi, T val) \{ ... \})$;

```
Time: \mathcal{O}\left(k\log\frac{n}{k}\right)
                                                            753a4c, 17 lines
template<class F, class G, class T> // hash-1
void rec(int from, int to, F& f, G& g, int& i, T& p, T q) {
 if (p == q) return;
 if (from == to) {
    g(i, to, p); i = to; p = q;
 } else {
    int mid = (from + to) >> 1;
    rec(from, mid, f, g, i, p, f(mid));
    rec(mid+1, to, f, g, i, p, q);
\frac{1}{2} / \frac{1}{2} hash - 1 = 69b73b
template<class F, class G> // hash-2
void constantIntervals(int from, int to, F f, G g) {
 if (to <= from) return;
 int i = from; auto p = f(i), q = f(to-1);
 rec(from, to-1, f, g, i, p, q); g(i, to, q);
\frac{1}{100} / \frac{1}{100} hash-2 = 856088
```

10.2 Misc. algorithms

ternary-search.h

Description: Find the smallest i in [a, b] that maximizes f(i), assuming that $f(a) < \ldots < f(i) \ge \cdots \ge f(b)$. To reverse which of the sides allows nonstrict inequalities, change the < marked with (A) to <=, and reverse the loop at (B). To minimize f, change it to >, also at (B). If you are dealing with real numbers, you'll need to pick $m_1 = (2a+b)/3.0$ and $m_2 = (a+2b)/3.0$. Consider setting a constant number of iterations for the search, usually [200, 300] iterations are sufficient for problems with error limit as 10^{-6} .

```
Usage: int ind = ternSearch(0, n-1, [&] (int i) {return a[i];});
Time: \mathcal{O}(\log(b-a))
                                                        35ef73, 11 lines
template<class F> int ternSearch(int a, int b, F f) {
 assert(a <= b);
 while (b - a >= 5) {
    int mid = (a + b) / 2;
    if (f(mid) < f(mid+1)) a = mid; //(A)
    else b = mid+1;
```

```
for (int i = a+1; i \le b; ++i)
 if (f(a) < f(i)) a = i; // (B)
return a;
```

count-triangles.h **Description:** Counts x, y >= 0 such that Ax + By <= C.

133eb4, 17 lines

```
ll count triangle(ll A, ll B, ll C)
 if (C < 0) return 0;
 if (A > B) swap(A, B);
 11 p = C / B, k = B / A, d = (C - p * B) / A;
 return count_triangle(B - k * A, A, C - A * (k * p + d + 1))
       + (p + 1) * (d + 1) + k * p * (p + 1) / 2;
```

flovd-cycle.h

Description: Detect loop in a list. Consider using mod template to avoid

```
Time: \mathcal{O}(n)
                                                       b456ab, 9 lines
template<class F> pair<int,int> find(int x0, F f) {
 int t = f(x0), h = f(t), mu = 0, lam = 1;
  while (t != h) t = f(t), h = f(f(h));
 h = x0;
  while (t != h) t = f(t), h = f(h), ++mu;
 h = f(t);
  while (t != h) h = f(h), ++lam;
  return {mu, lam};
```

10.3 Dynamic programming

divide-and-conquer-dp.h

Description: Given $a[i] = \min_{lo(i) < k < hi(i)} (f(i, k))$ where the (minimal) optimal k increases with i, computes $\bar{a}[i]$ for i = L..R - 1.

```
Time: \mathcal{O}((N + (hi - lo)) \log N)
                                                                             c7f2d1, 29 lines
```

```
struct DP { // hash-1
     vector<int>a, freq;
     vector<ll>old, cur;
     ll cnt; int lcur, rcur;
      DP(const vector<int>&_a, int n): a(a), freq(n), old(n+1,
                       linf), cur(n+1, linf), cnt(0), lcur(0), rcur(0){}
      int lo(int ind) { return 0; }
      int hi(int ind) { return ind; }
      void add(int k, int c) { cnt += freg[a[k]]++; }
      void del(int k, int c) { cnt -= --freq[a[k]]; }
     11 C(int 1, int r) {
             while(lcur > 1) add(--lcur, 0);
             while(rcur < r) add(rcur++, 1);</pre>
             while(lcur < 1) del(lcur++, 0);</pre>
             while(rcur > r) del(--rcur, 1);
             return cnt;
       \frac{1}{2} // hash-1 = 7cabd1
      11 f(int ind, int k) { return old[k] + C(k, ind); } // hash=2
      void store(int ind, int k, ll v) { cur[ind] = v; }
      void rec(int L, int R, int LO, int HI) {
             if (L >= R) return;
             int mid = (L + R) \gg 1;
             pair<11, int> best(LLONG_MAX, LO);
             for (int k = max(LO, lo(mid)); k \le min(HI, hi(mid)); ++k)
                   best = min(best, make_pair(f(mid, k), k));
             store(mid, best.second, best.first);
             rec(L, mid, LO, best.second);
             rec(mid+1, R, best.second, HI);
\frac{1}{3}; \frac{1}{3} \frac{1
```

knuth-dp.h

Description: When doing DP on intervals: $a[i][j] = \min_{i < k < j} (a[i][k] + a[k][j]) + f(i,j)$, where the (minimal) optimal k increases with both i and j, one can solve intervals in increasing order of length, and search k = p[i][j] for a[i][j] only between p[i][j-1] and p[i+1][j]. This is known as Knuth DP. Sufficient criteria for this are if $f(b,c) \le f(a,d)$ and $f(a,c)+f(b,d) \le f(a,d)+f(b,c)$ for all $a \le b \le c \le d$. Consider also: LineContainer (ch. Data structures), monotone queues, ternary search. **Time:** $\mathcal{O}\left(N^2\right)$

digit-dp.h

Description: Compute how many # between 1 and N have K distinct digits in the base L without leading zeros;

```
Usage: auto hex_to_dec = [&] (char c) \rightarrow int { return ('A' <= c && c <= 'F' ? (10 + c - 'A') : (c - '0')); }; }; digit_dp<modnum<int(1e9) + 7>, hex_to_dec>(N, K); Time: \mathcal{O}(NK)
```

```
template<typename T, class F> T digit_dp(const string& S, int K
    , F& L) {
  const int base = 16, len = int(S.size());
 vector<bool> w(base);
 vector<vector<T>> dp(len + 1, vector<T>(base + 2));
 int cnt = 0;
  for (int d = 0; d < len; ++d) {
    // adding new digit to numbers with prefix < s
   for (int x = 0; x \le base; ++x) {
     dp[d + 1][x] += dp[d][x] * x;
     dp[d + 1][x + 1] += dp[d][x] * (base - x);
    // adding strings whith prefix only 0's and last digit != 0
   if (d) dp[d + 1][1] += (base - 1);
    // adding prefix equal to s and last digit < s, first digit
         cannot be 0
    for (int x = 0; x < L(S[d]); ++x)
     if (d == 0 && x == 0) continue;
     if (w[x]) dp[d + 1][cnt] += 1;
     else dp[d + 1][cnt + 1] += 1;
    // marking if the last digit appears in the prefix of s
    if (w[L(S[d])] == false)
     w[L(S[d])] = true, cnt++;
  // adding string k
 dp[len][cnt] += 1; return dp[len][K];
```

knapsack-bounded.h

Description: You are given n types of items, each items has a weight and a quantity. Is possible to fill a knapsack with capacity X using any subset of items?

Time: $\mathcal{O}\left(W\cdot N\right)$ b24799, 11 lines

```
auto solve(vi weight, vi cnt, int X) {
  vector<int> dp(X+1, 0);
  for (int i = 0; i < N; ++i)
    for (int j = X-weight[i]; j >= 0; --j) {
      if (!dp[j]) continue;
      int k = cnt[i], s = j + weight[i];
      while (k > 0 && s <= X && !dp[s])
          dp[s] = 1, --k, s += weight[i];
  }
  return dp[X];
}</pre>
```

knapsack-bounded-costs.h

Description: You are given N types of items, you have cnt[i] items of i-th type, and each item of i-th type weight[i] and cost[i]. What is the maximal cost you can get by picking some items weighing exactly X in total? **Time:** $\mathcal{O}(N \cdot W)$

```
"../data-structures/monotonic-queue.h" 03d171, 15 lines
auto solve(vi weight, vi cost, vi cnt, int X) {
  vector<int> dp(X+1, 0); int N = int(weight.size());
  vector<max_monotonic_queue<int>> M(X+1);
  for (int i = 0; i < N; ++i) {
    for (int j = 0; j < min(X+1, weight[i]); ++j)
        M[j] = max_monotonic_queue<int>();
    for (int j = 0; j <= X; ++j) {
        auto& que = M[j % weight[i]];
        if (que.size() > cnt[i]) que.pop();
        que.add(cost[i]);
        que.push(dp[j]);
        dp[j] = que.get_val();
    }
} return dp[X];
}
```

two-max-equal-sum.h

Description: Two maximum equal sum disjoint subsets, s[i] = 0 if v[i] wasn't selected, s[i] = 1 if v[i] is in the first subset and s[i] = 2 if v[i] is in the second subset

10.4 Optimization tricks

10.4.1 Bit hacks

- c = x&-x, r = x+c; $(((r^x) >> 2)/c) | r$ is the next number after x with the same number of bits set.
- rep(b,0,K) rep(i,0,(1 << K)) if (i & 1 <<
 b) D[i] += D[i^(1 << b)]; computes all sums of subsets.

10.5 Bit Twiddling Hack

```
hacks.h

// Iterate on non-empty submasks of a bitmask.
for (int s = m; s > 0; s = (m & (s - 1)))
// Iterate on non-zero bits of a bitset B. // hash-1
for (int j = B._Find_next(0); j < MAXV; j = B._Find_next(j))
ll next_perm(ll v) { // compute next perm i.e.
ll t = v | (v-1); // 00111,01011,01011 ...
return (t + 1) | (((<t & -<t) - 1)>> (_builtin_ctz(v) + 1));
} // hash-1 = 2392b3
template<typename F> // All subsets of size k of {0..N-1}
void iterate_k_subset(ll N, ll k, F f) { // hash-2
```

```
11 mask = (111 << k) - 1;
while (!(mask & 111 << N)) { f(mask);
    11 t = mask | (mask-1);
    mask = (t+1) | (((~t & -~t)-1)>> (_builtin_ctzll(mask)+1));
} // hash-2 = 87802c
template<typename F> // All subsets of set // hash-3
void iterate_mask_subset(11 set, F f) { 11 mask = set;
    do f(mask), mask = (mask-1) & set;
    while (mask != set);
} // hash-3 = 3b9428
```

10.6 Random Numbers

random-numbers.h

Description: An example on the usage of generator and distribution. Use shuffle instead of random shuffle.