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8. USEFUL INFORMATION (CLEAN THIS UP!!)		· sufficient: QI and $C[b][c] \leq C[a][d], a \leq b \leq c \leq d$	
9. Misc			
9.1. Debugging Tips.	<ul style="list-style-type: none"><li>• Stack overflow? Recursive DFS on tree that is actually a long path?</li><li>• Floating-point numbers<ul style="list-style-type: none"><li>– Getting <b>NaN</b>? Make sure <b>acos</b> etc. are not getting values out of their range (perhaps <b>1+eps</b>).</li><li>– Rounding negative numbers?</li><li>– Outputting in scientific notation?</li></ul></li><li>• Wrong Answer?<ul style="list-style-type: none"><li>– Read the problem statement again!</li><li>– Are multiple test cases being handled correctly? Try repeating the same test case many times.</li><li>– Integer overflow?</li><li>– Think very carefully about boundaries of all input parameters</li><li>– Try out possible edge cases:<ul style="list-style-type: none"><li>* <math>n = 0, n = -1, n = 1, n = 2^{31} - 1</math> or <math>n = -2^{31}</math></li><li>* List is empty, or contains a single element</li><li>* <math>n</math> is even, <math>n</math> is odd</li><li>* Graph is empty, or contains a single vertex</li><li>* Graph is a multigraph (loops or multiple edges)</li><li>* Polygon is concave or non-simple</li></ul></li><li>– Is initial condition wrong for small cases?</li><li>– Are you sure the algorithm is correct?</li><li>– Explain your solution to someone.</li><li>– Are you using any functions that you don't completely understand? Maybe STL functions?</li><li>– Maybe you (or someone else) should rewrite the solution?</li><li>– Can the input line be empty?</li></ul></li><li>• Run-Time Error?<ul style="list-style-type: none"><li>– Is it actually Memory Limit Exceeded?</li></ul></li></ul>	<ul style="list-style-type: none"><li>• Greedy</li><li>• Randomized</li><li>• Optimizations<ul style="list-style-type: none"><li>– Use bitset (/64)</li><li>– Switch order of loops (cache locality)</li></ul></li><li>• Process queries offline<ul style="list-style-type: none"><li>– Mo's algorithm</li></ul></li><li>• Square-root decomposition</li><li>• Precomputation</li><li>• Efficient simulation<ul style="list-style-type: none"><li>– Mo's algorithm</li><li>– Sqrt decomposition</li><li>– Store <math>2^k</math> jump pointers</li></ul></li><li>• Data structure techniques<ul style="list-style-type: none"><li>– Sqrt buckets</li><li>– Store <math>2^k</math> jump pointers</li><li>– <math>2^k</math> merging trick</li></ul></li><li>• Counting<ul style="list-style-type: none"><li>– Inclusion-exclusion principle</li><li>– Generating functions</li></ul></li><li>• Graphs<ul style="list-style-type: none"><li>– Can we model the problem as a graph?</li><li>– Can we use any properties of the graph?</li><li>– Strongly connected components</li><li>– Cycles (or odd cycles)</li><li>– Bipartite (no odd cycles)<ul style="list-style-type: none"><li>* Bipartite matching</li><li>* Hall's marriage theorem</li><li>* Stable Marriage</li></ul></li><li>– Cut vertex/bridge</li><li>– Biconnected components</li><li>– Degrees of vertices (odd/even)</li><li>– Trees<ul style="list-style-type: none"><li>* Heavy-light decomposition</li><li>* Centroid decomposition</li><li>* Least common ancestor</li><li>* Centers of the tree</li></ul></li><li>– Eulerian path/circuit</li><li>– Chinese postman problem</li><li>– Topological sort</li><li>– (Min-Cost) Max Flow</li><li>– Min Cut<ul style="list-style-type: none"><li>* Maximum Density Subgraph</li></ul></li><li>– Huffman Coding</li><li>– Min-Cost Arborescence</li><li>– Steiner Tree</li><li>– Kirchoff's matrix tree theorem</li><li>– Prüfer sequences</li><li>– Lovász Toggle</li><li>– Look at the DFS tree (which has no cross-edges)</li><li>– Is the graph a DFA or NFA?<ul style="list-style-type: none"><li>* Is it the Synchronizing word problem?</li></ul></li></ul></li><li>• Mathematics<ul style="list-style-type: none"><li>– Is the function multiplicative?</li><li>– Look for a pattern</li></ul></li></ul>	<ul style="list-style-type: none"><li>– Permutations<ul style="list-style-type: none"><li>* Consider the cycles of the permutation</li></ul></li><li>– Functions<ul style="list-style-type: none"><li>* Sum of piecewise-linear functions is a piecewise-linear function</li><li>* Sum of convex (concave) functions is convex (concave)</li></ul></li><li>– Modular arithmetic<ul style="list-style-type: none"><li>* Chinese Remainder Theorem</li><li>* Linear Congruence</li></ul></li><li>– Sieve</li><li>– System of linear equations</li><li>– Values too big to represent?<ul style="list-style-type: none"><li>* Compute using the logarithm</li><li>* Divide everything by some large value</li></ul></li><li>– Linear programming<ul style="list-style-type: none"><li>* Is the dual problem easier to solve?</li></ul></li><li>– Can the problem be modeled as a different combinatorial problem? Does that simplify calculations?</li></ul> <ul style="list-style-type: none"><li>• Logic<ul style="list-style-type: none"><li>– 2-SAT</li><li>– XOR-SAT (Gauss elimination or Bipartite matching)</li></ul></li><li>• Meet in the middle</li><li>• Only work with the smaller half (<math>\log(n)</math>)</li><li>• Strings<ul style="list-style-type: none"><li>– Trie (maybe over something weird, like bits)</li><li>– Suffix array</li><li>– Suffix automaton (+DP?)</li><li>– Aho-Corasick</li><li>– eerTree</li><li>– Work with <math>S + S</math></li></ul></li><li>• Hashing</li><li>• Euler tour, tree to array</li><li>• Segment trees<ul style="list-style-type: none"><li>– Lazy propagation</li><li>– Persistent</li><li>– Implicit</li><li>– Segment tree of X</li></ul></li><li>• Geometry<ul style="list-style-type: none"><li>– Minkowski sum (of convex sets)</li><li>– Rotating calipers</li><li>– Sweep line (horizontally or vertically?)</li><li>– Sweep angle</li><li>– Convex hull</li></ul></li><li>• Fix a parameter (possibly the answer).</li><li>• Are there few distinct values?</li><li>• Binary search</li><li>• Sliding Window (+ Monotonic Queue)</li><li>• Computing a Convolution? Fast Fourier Transform</li><li>• Computing a 2D Convolution? FFT on each row, and then on each column</li><li>• Exact Cover (+ Algorithm X)</li><li>• Cycle-Finding</li><li>• What is the smallest set of values that identify the solution? The cycle structure of the permutation? The powers of primes in the factorization?</li><li>• Look at the complement problem</li></ul>
9.2. Solution Ideas.	<ul style="list-style-type: none"><li>• Dynamic Programming<ul style="list-style-type: none"><li>– Parsing CFGs: CYK Algorithm</li><li>– Drop a parameter, recover from others</li><li>– Swap answer and a parameter</li><li>– When grouping: try splitting in two</li><li>– <math>2^k</math> trick</li><li>– When optimizing<ul style="list-style-type: none"><li>* Convex hull optimization<ul style="list-style-type: none"><li>· <math>dp[i] = \min_{j &lt; i} \{dp[j] + b[j] \times a[i]\}</math></li><li>· <math>b[j] \geq b[j + 1]</math></li><li>· optionally <math>a[i] \leq a[i + 1]</math></li><li>· <math>O(n^2)</math> to <math>O(n)</math></li></ul></li><li>* Divide and conquer optimization<ul style="list-style-type: none"><li>· <math>dp[i][j] = \min_{k &lt; j} \{dp[i - 1][k] + C[k][j]\}</math></li><li>· <math>A[i][j] \leq A[i][j + 1]</math></li><li>· <math>O(kn^2)</math> to <math>O(kn \log n)</math></li><li>· sufficient: <math>C[a][c] + C[b][d] \leq C[a][d] + C[b][c], a \leq b \leq c \leq d</math> (QI)</li></ul></li><li>* Knuth optimization<ul style="list-style-type: none"><li>· <math>dp[i][j] = \min_{i &lt; k &lt; j} \{dp[i][k] + dp[k][j] + C[i][j]\}</math></li><li>· <math>A[i][j - 1] \leq A[i][j] \leq A[i + 1][j]</math></li><li>· <math>O(n^3)</math> to <math>O(n^2)</math></li></ul></li></ul></li></ul></li></ul>		

- Minimize something instead of maximizing
- Immediately enforce necessary conditions. (All values greater than 0? Initialize them all to 1)
- Add large constant to negative numbers to make them positive
- Counting/ Bucket sort

10. FORMULAS

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

10.1. Physics.

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

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

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

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

A MC for a random walk in an undirected weighted graph (un-weighted graph can be made weighted by adding 1-weights) has  $p_{uv} = w_{uv} / \sum_x w_{ux}$ . If the graph is connected, then  $\pi_u = \sum_x w_{ux} / \sum_v \sum_x w_{vx}$ . Such a random walk is aperiodic iff. the graph is not bipartite.

An *absorbing* MC is of the form  $P = \begin{pmatrix} Q & R \\ 0 & I_r \end{pmatrix}$ . Let  $N = \sum_{m=0}^\infty Q^m = (I_t - Q)^{-1}$ . Then, if starting in state  $i$ , the expected number of steps till absorption is the  $i$ -th entry in  $N1$ . If starting in state  $i$ , the probability of being absorbed in state  $j$  is the  $(i, j)$ -th entry of  $NR$ .

Many problems on MC can be formulated in terms of a system of recurrence relations, and then solved using Gaussian elimination.

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

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

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

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

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

10.5. Misc.

10.5.1. *Determinants and PM.*

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

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

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

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

10.5.3. *Primitive Roots.* Only exists when  $n$  is  $2, 4, p^k, 2p^k$ , where  $p$  odd prime. Assume  $n$  prime. Number of primitive roots  $\phi(\phi(n))$  Let  $g$  be primitive root. All primitive roots are of the form  $g^k$  where  $k, \phi(p)$  are coprime.

$k$ -roots:  $g^{i \cdot \phi(n)/k}$  for  $0 \leq i < k$

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

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

10.5.5. *Floor.*

$$\lfloor \lfloor x/y \rfloor / z \rfloor = \lfloor x/(yz) \rfloor$$

$$x \% y = x - y \lfloor x/y \rfloor$$

PRACTICE CONTEST CHECKLIST

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