# Interactives and Randomised Algorithms

Max Godfrey 12/04/2022

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#### Interactive Problems

#### Module Tasks

- Ask the grader some questions and then tell it your answer once you are confident
- Constrained by the number of queries you can ask (commonly denoted Q)
- Eg. Find my Number and Jealousy

#### 2. Communication/Two-Step Tasks

- Write two routines which communicate with one another
- Routine 1's output is passed to Routine 2 (usually via parameters)
- It is common for Routine 1's input to be obfuscated before being given to Routine 2
- Constrained by what you are allowed to send, for example:
  - Not allowed to send more than k things
  - Each thing you send must conform to some constraints (eg. Integer in  $[1,10^5]$ )

# Module Task Tips

- Think about where Q comes from:
  - Commonly Q is  $\log_2 N$ , or  $N \log_2 N$  (or slightly greater than those values)
  - The value of Q hints at the intended solution
  - Module tasks are often solvable with DnC or Binary Searching
- Query Conservation:
  - Think about the implications of one of your queries returning false
  - Eg. If you are told that something you're looking for isn't in the left half of the data, you *know* that it has to be in the right half of the data
  - Don't waste queries verifying things which must be true as implied by other queries' results
- Don't be afraid to use up all your queries:
  - You can't afford to spend time coming up with a solution using 0.5Q queries; you won't be penalised if you use exactly Q

# Two-Step Tips

- Mappings are your friend:
  - It is possible that we can map every possible encoding to a unique value according to the constraints, and then send that value
  - To decode, work out the original input corresponding to your mapping
  - Tends to feature in problems where you are allowed to send more things than there are in the input
- Find a way to compress the data:
  - The input you are given will be bloated in some way
  - Often by finding a good compression, you can get subtasks (or sliding-scale points)

#### Cave Statement

- You are given N switches which may either be flipped up or down
  - $1 \le N \le 5000$
- Each switch controls one of N doors in a line (numbered from 1 to N), and the i-th switch may or may not control the i-th door
  - You do not know which switch controls each door
- A switch's *correct position* (ie. The position it must be in to open its respective door) is either *up* or *down*, and you must determine:
  - The correct position of all switches, and
  - The door controlled by each switch
- You are allowed to call tryCombination(p) up to 70000 times:
  - p is a permutation of N integers, the i-th of which is 1 if the i-th switch is flipped down, otherwise 0 if it is flipped up
  - The function returns the index of the first closed door, or -1 if all doors are open

#### Cave Subtasks

- 1. [12 Points]: The i-th switch is connected to the i-th door
  - All you need to do is determine the correct combination (this hint is specifically given in the task description)
- 2. [13 Points]: The *correct position* of each switch is 0
  - All you need to do is determine which switch connects to each door (ditto)
- 3. [21 Points]:  $N \le 100$
- 4. [30 Points]:  $N \le 2000$
- 5. [24 Points]: No further constraints ( $N \le 5000$  as stated earlier)

#### **Full Solution**

- My tip on Slide 4 suggested that we should look for logarithmic factors
- For the first door:
  - Set all switches to 0
  - If tryCombination > 1, we binary search with all switches up(0)
  - At each level, set the left range to 1 and see if tryCombination > 1
    - If the condition is true, then the switch controlling Door 1 isn't in the left range
    - This means it has to be in the right range don't waste a query verifying this!
  - Undo the range set (and set everything in the right range to 1), or traverse the right range depending on the result
  - Repeat until we have set all switches to 1 except one of them
- For all successive doors, do the same as above, but maintain all correct positions we know about so far
- $O(N \log_2 N)$  queries gets us AC on an IOI problem not bad!
  - This is actually better than a lot of Bronze Medallists performed on this task

#### Combo Statement

- A video game controller has four buttons: A, B, X, and Y
- You get points for making Combo Moves, which are done by pressing sequences of buttons
- The game has a secret sequence of button presses S, of length N
  - The first character of S never reappears in it (ie. S cannot be "BXYABA")
- You are allowed to call press(p), where p is a string:
  - press(p) returns an integer: the length of the largest prefix of S which is also a substring of p
  - For instance, if S = "ABXYY" and p = "XXYYABYABXAY", press(p) = 3
    - This is because "ABX" is the largest prefix of S appearing in p
  - $|p| \leq 4N$

#### Combo Subtasks

- 1. [5 Points]: N = 3
- 2. [95 Points]:  $N \le 2000$ 
  - Let q be the number of calls your program makes to press
  - If  $q \le N + 2$ , your score is 95
  - If  $N + 1 < q \le N + 10$ , your score is 95 3(q N 2)
  - If  $N + 10 < q \le 2N + 1$ , your score is 25
  - If  $\max(N + 10, 2N + 1) < q \le 4N$ , your score is 5
  - Otherwise, your score is 0

### Brute Force — 10 Points

- For N = 3:
  - Our score is not determined based on the number of times we call press
  - Try all possible strings
- For  $N \le 2000$ , Q = 4N:
  - We can brazenly guess all four characters for each position of S
  - Don't be afraid to use all the queries we are allowed!
  - 5 Points on Subtask 2

#### Brute Force – 20 More Points

- For  $N \le 2000$ , Q = 4N:
  - Suppose that k is some known prefix of S
  - We will denote the three characters that *S* is built from after the first character 1, 2, and 3
  - We determine the i-th character of S by guessing k+1, and (if that fails) k+2
    - From this, we can infer that the *i*-th character is 3 in the instance that both of our checks failed
  - We use similar logic to determine the first character of S in three guesses
  - 3 + (N-1) \* 2 = 2N + 1 guesses in the worst case
  - This gives us 25 points on Subtask 2
- At the 2018 IOI, the 107<sup>th</sup> participant (one of the highest-scoring Bronze Medallists) scored 30 points on this problem
- Is it possible to determine the first character of S in two guesses?

#### Full Solution – 70 More Points

- Observe that the fact that the first character of S is different to the remainder of its characters allows us to make multiple guesses at once
- Can we come up with a way to determine the i-th character of S in one guess?
- For  $N \le 2000$ ,  $Q \le N + 2$ :
  - Suppose that k is some prefix of S
  - We will denote the three characters that *S* is built from after the first character 1, 2, and 3
  - Spend at most two guesses to determine the first character
  - For all remaining characters bar the last one, guess k + 1 + k + 21 + k + 22 + k + 23":
    - If press returns |k| + 1, the next character is 1
    - If press returns |k| + 2, the next character is 2
    - Otherwise, the next characters is 3
  - Spend at most two guesses to determine the final character
  - 2 + (N-2) + 2 = N + 2 guesses in the worst case AC!

#### Parrots Statement

- We have a message M of N integers between 0 and 255 (inclusive) which we wish to send to a faraway land
- We have K indistinguishable parrots who will carry the message for us; each parrot can carry an integer between 0 and R (inclusive)
- However, the parrots will not necessarily arrive at their destination in the order that we send them off in
- We must write an encoder given N and M:
  - This function can call send(x) up to K times, which will send a parrot to its destination
  - All parrots will arrive at their destination and correctly convey the integer which they carry
- We must also write a decoder given N, L, and X:
  - *L* is the number of parrots we originally sent
  - X is the message we sent, but reordered
  - This function must call output(x) for each x in M (in order)

## Subtask 1 – 17 Points

- N=8, and each integer in M is either 0 or 1
- Each encoded integer must be between 0 and 65535, inclusive
  - $R = 2^{16} 1$
- You are allowed to call send(x) at most 10N times

## Subtask 1 – 17 Points

- N=8, and each integer in M is either 0 or 1
- Each encoded integer must be between 0 and 65535, inclusive
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- You are allowed to call send(x) at most 10N times

#### The solution:

- According to my tip regarding two-step tasks, the input is bloated in some way and we can exploit this
- A neat way to provide an easily re-constructible sequence is to send the positions of all indices in M where  $M_i=1$

## Subtask 2 – 17 More Points

- N = 8
- Each encoded integer must be between 0 and 65535, inclusive
  - $R = 2^{16} 1$
- You are allowed to call send(x) at most 10N times
- Subtask 1, except that  $0 \le M_i \le 255$

## Subtask 2 – 17 More Points

- $1 \le N \le 16$
- Each encoded integer must be between 0 and 65535, inclusive
  - $R = 2^{16} 1$
- You are allowed to call send(x) at most 10N times
- Since there are no further constraints on M's values,  $0 \le M_i \le 255$

#### The solution:

- Observe that we get to send 16 bits' worth of information per parrot
  - Each  $M_i$  requires 8 bits to be stored as  $\lceil \log_2 255 \rceil = 8$
  - Each position in M requires 4 bits to be stored  $\log_2 16 = 4$
- With each number we send:
  - The first 8 bits represent  $M_i$  (the value)
  - The following 4 bits represent *i* (the position of the value)

#### Subtask 3 – 18 More Points

- $1 \le N \le 16$
- Each encoded integer must be between 0 and 255, inclusive
- You are allowed to call send(x) at most 10N times
- Incentive: If you solve this subtask, you will have equalled the score achieved by a former Director of Training on this task when he competed in the 2011 IOI

### Subtask 3 – 18 More Points

- $1 \le N \le 16$
- Each encoded integer must be between 0 and 255, inclusive
- You are allowed to call send(x) at most 10N times

#### The solution:

- Observe that this time we are only allowed to send 8 bits per parrot
- Since there are 16\*8=128 bits total in the message, we can send 128 integers
- In a similar manner to our Subtask 2 solution, in each number we send:
  - The first 7 bits represent the position of the i-th bit in the bit-string produced by concatenating all binary representations within M
  - The final bit represents the value of the *i*-th bit

## Subtask 4 – 18 More Points

- $1 \le N \le 32$
- Each encoded integer must be between 0 and 255, inclusive
- You are allowed to call send(x) at most 10N times

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- Each encoded integer must be between 0 and 255, inclusive
- You are allowed to call send(x) at most 10N times

#### The solution:

- We combine our Subtask 1 and Subtask 2 observations
- The bit-string now has 32 \* 8 = 256 bits total
  - Instead of sending the position and value of every bit, we just send the
    positions of each set bit (ie. The locations of all the 1s)
- Alternative binary formats:
  - The first 5 bits represent the index of *M* we will modify
  - The final 3 bits represent the position of the bit in  $M_i$  that we wish to set
- There are many ways to structure our numbers!

# Subtask 5 – up to 19 More Points

- $16 \le N \le 64$
- Each encoded integer must be between 0 and 255, inclusive
- You are allowed to call send(x) at most 15N times
- For the *i*-th test case,  $P_i = \frac{L_i}{N_i}$  (ie. The ratio between the number of times you call send(x) and the length of M)
- Let  $P = \max P_i$  across all cases:
  - If  $P \le 5$ , you get 19 points
  - If  $5 < P \le 6$ , you get 18 points
  - If  $6 < P \le 7$ , you get 17 points
  - If  $7 < P \le 15$ , you get [1 + 2(15 P)] points
  - Otherwise, you get 0 points

# The Subtle Art of Giving Up

- The bit-string now has 64 \* 8 = 512 bits total, so we cannot afford to send the information pertaining to each bit
- Instead, we can send information pertaining to each pair of bits
- Pair  $i = (M_{2i}, M_{2i+1})$  note that there are 4 possible values of this pair
- Then, for each pair in the bit-string, we send its position and value
  - Problem: encoding the position takes 8 bits
- Instead of encoding the value, we just send the position multiple times corresponding to the values of the pair:
  - Sending the *i*-th pair no times corresponds to 00
  - Sending it once corresponds to 01
  - Sending it twice corresponds to 10
  - Sending it three times corresponds to 11
- This achieves P = 12 and we get 7 points for it

# The Subtle Art of Giving Up

- There are some observations that can be made to improve the previous solution and achieve  $P \approx 6$ , which will give us 17 points for this subtask
  - I leave all further improvements to these algorithms as an exercise to you
- The problem with sliding-scale tasks is that the closer you get to the full solution, the more time you spend trying to get a very small amount of points
  - They can be a real time-sink in contests, and there comes a point where they are no longer a good use of your time
  - If you have some easy subtasks you haven't solved, those take priority over a small amount of points on a problem
- Knowing when to give up on a problem is very important, and can be learned by practicing good exam technique
  - Use the trial exams to your advantage!

# Randomised Algorithms

- In some cases, it is possible to solve a problem using a Randomised Algorithm, even if the problem is not related to any random processes
- A Randomised Algorithm is some kind of process which depends on one or more random variables
- Las Vegas Algorithms:
  - Keep running until it finds the optimal solution
  - Solution is optimal, but runtime can vary hugely
- Monte Carlo Algorithms:
  - Runs according to some random variables and finds a solution
  - · Solution has a chance of being optimal, but runtime is fixed
- Since we tend to be constrained by time in Informatics, we prefer Monte Carlo Algorithms

# Monte Carlo Algorithms

- Suppose that a Monte Carlo Algorithm has a probability  ${\cal P}$  of returning an optimal solution
- If we submit this algorithm, on average we will only pass a proportion of the subtasks equal to P
- However, if we run the algorithm N times in the same programme, the probability of success is  $1-(1-P)^N$ 
  - For large N, there is a great chance that our algorithm will produce an optimal solution

#### Problem: Colinear Points

- Given N points on a 2D plane, find the equation of a line passing through at least 0.25N of the points  $(N \le 10^6)$
- You are guaranteed that such a line exists

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- Given N points on a 2D plane, find the equation of a line passing through at least 0.25N of the points  $(N \le 10^6)$
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- If we select a point randomly, there is a probability of at least 0.25 that the point exists on the line
- If we select two points randomly, there is a 0.0625 chance that they are both on the line
  - This can be verified in O(N)
- We have an O(N) Monte Carlo algorithm
- Repeated 20 times:  $Pr(success) \approx 0.7249$
- Repeated 100 times:  $Pr(success) \approx 0.9984$

# Writing a Randomised Algorithm

- Monte Carlo Algorithms generally take the form of selecting some data points randomly, building a solution based off their values, and verifying it
- You must determine the probability of each iteration of your algorithm succeeding
- Consider the most "Realistic Pessimistic Case"
  - ie. How many times should I have to run this algorithm in the worst case before it comes up with an optimal solution?

# The Birthday Problem

- How many people would you need to gather together for there to be a reasonable chance that at least two of them have the same birthday?
  - For simplicity, assume that there are 365 days in a year and that the day someone is born on can be modelled by a continuous uniform distribution
- The probability that a group of *n* people have no birthdays in common is:

$$\frac{365}{365} \times \frac{364}{365} \times \dots \times \frac{365 - n + 1}{365}$$

• It happens that when  $n \approx 23$ , there is a  $\sim 50\%$  chance that there will be a double-up of birthdays in the group

# More broadly...

- If you are given N data points as part of your input, and you need to find two points satisfying some property, there is a moderate probability that you will find a pair by sampling around  $\sqrt{N}$  points
- Further reading: <a href="https://en.wikipedia.org/wiki/Birthday">https://en.wikipedia.org/wiki/Birthday</a> problem#Square approximation

# Warning: Adversarial Graders

- Some interactive tasks have graders which will modify their data according to what you ask them
  - They will never lie to you, but they will make everything as difficult for you as possible
  - Imagine playing I-Spy with a sibling who has a list of things beginning with their chosen letter, and will only let you win when they have nothing else to make your 'interaction' any more difficult for you
- You cannot use randomised algorithms on these tasks: the grader will make them fail
- Chances are that only a deterministic solution will pass these problems
- For instance, Spies III on Orac 2 is adversarial the same problem on Orac 1 can be solved using a Monte Carlo Algorithm

# Warning: Setting a Random Seed

- For local testing and submitting to all competitions in the Australian Informatics Olympiad Program, manually setting your seed is good
  - It allows your computer's Pseudo-Random Number Generator to come up with the same numbers every time you run it
  - This is great for testing
- However, if you submit to a platform like CF where Hacking is a part of the competitions, you run the risk of being hacked if you use a Randomised Algorithm:
  - People have figured out how to break solutions which generate pseudorandom numbers from a custom seed
  - Apparently in some cases it is very easy to come up with a case that breaks specific random seeds on certain problems

# How to Randomise your Seed

- srand(time(NULL))
  - Sets your random seed based on the current second
  - For most intents and purposes, this is fine
  - However, there are some very smart people out there who have probably figured out how seeding works based on the current second on the Codeforces platform; we need to do better
- srand(chrono::steady\_clock::now().time\_since\_epoch().count())
  - Sets your random seed based on the current millisecond/nanosecond
  - Much better!

## Your Problemset

- 1. Cave
- 2. Combo
- 3. Parrots
- 4. River
- 5. Quicksearch
- 6. Pizza Problems