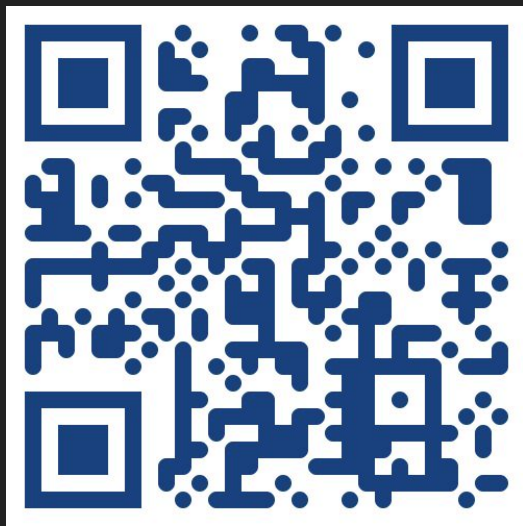


Algorithms and Probability

Exercise Session 8



<https://n.ethz.ch/~ahmala/anw>

MINITEST

Time limit: 11 minutes

Number of questions: 11

Threshold to get 1 point: 7 correct answers

Threshold to get 2 points: 9 correct answers

Do Not Rush!

PASSWORD: ****

PASSWORD: capital

Monte Carlo Algorithms: One Sided Errors

We say that a Monte Carlo algorithm A for a decision problem has a one-sided error if and only if, for some $\varepsilon > 0$:

$\Pr[A(I) = YES] = 1$ if the correct answer for input I is YES, and

$\Pr[A(I) = NO] \geq \varepsilon$ if the correct answer for input I is NO

for any input I .

Primality Tests I

```
1 Choose  $1 \leq a < n$  uniformly at random
2 if  $\gcd(a, n) \neq 1$ 
3     return "not prime"
4 else
5     return "prime"
```

Is this one sided error?

$\Pr[A(I) = \text{"not prime"}] = ?$

$\Pr[A(I) = \text{"prime"}] = ?$

Primality Tests I

```
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```

Is this one sided error? **Yes**

$\Pr[A(I) = \text{"not prime"}] = 1$

$\Pr[A(I) = \text{"prime"}] \geq \epsilon$

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$\Pr[A(I) = \text{"not prime"}] = 1$

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Can you increase the chance of success to a higher probability using only this algorithm?

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Is this one sided error? **Yes**

$\Pr[A(I) = \text{"not prime"}] = 1$

$\Pr[A(I) = \text{"prime"}] \geq \epsilon$

Can you increase the chance of success to a higher probability using only this algorithm?

Just run it multiple times!

Primality Tests I

```
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2 if  $\gcd(a, n) \neq 1$ 
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Is this one sided error? **Yes**

$\Pr[A(I) = \text{"not prime"}] = 1$

$\Pr[A(I) = \text{"prime"}] \geq \epsilon$

Can you increase the chance of success to a higher probability using only this algorithm?

How many times to run?

Primality Tests I

```
1 import java.util.Random;
2 import java.util.concurrent.ThreadLocalRandom;
3
4 public class prime {
5     public static void main(String[] args) {
6         Random rng = new Random(System.currentTimeMillis());
7
8         int N = 100000; // 10^5
9         int number_of_trials = 1;
10        int x = 99899; // 283*353
11
12
13        for (int i = 0; i < number_of_trials; ++i) {
14            int random_number = chooseRandom(rng, N);
15            if (gcd(random_number, x) != 1) {
16                System.out.println("Not Prime");
17                return;
18            }
19        }
20
21        System.out.println("Prime");
22    }
23
24    // choose a random integer in [1, N];
25    public static int chooseRandom(Random rng, int N) {
26        return rng.nextInt(N - 1) + 1;
27    }
28
29    public static int gcd(int a, int b) {
30        if (b == 0) return a;
31        return gcd(b, a % b);
32    }
33 }
34
```

We want to check if $x=99899$ is a prime number.

$$99899 = 283 \cdot 353$$

How many times should we run the algorithm

```
1 Choose  $1 \leq a < n$  uniformly at random
2 if  $\gcd(a, n) \neq 1$ 
3     return "not prime"
4 else
5     return "prime"
```

Primality Tests I

$\Pr[\text{gcd}(\text{random_number}, x) \neq 1]$
= $\Pr[\text{random_number} \text{ being a multiple of } 283]$
+ $\Pr[\text{random_number} \text{ being a multiple of } 353]$
- $\Pr[\text{random_number} \text{ being a multiple of } 283 \cdot 353]$

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- $\Pr[\text{random_number} \text{ being a multiple of } 283 \cdot 353]$

$\Pr[\gcd(\text{random_number}, x) \neq 1]$
= $(353+283-1) / 100000 = 0.00635$

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2 import java.util.concurrent.ThreadLocalRandom;
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4 public class prime {
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Primality Tests I

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+ $\Pr[\text{random_number} \text{ being a multiple of } 353]$
- $\Pr[\text{random_number} \text{ being a multiple of } 283 \cdot 353]$

$\Pr[\text{gcd}(\text{random_number}, x) \neq 1]$
= $(353 + 283 - 1) / 100000 = 0.00635$

With probability $1 - 0.00635 = 0.99365$ the algorithm fails.

```
1 import java.util.Random;
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4 public class prime {
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+ $\Pr[\text{random_number} \text{ being a multiple of } 353]$
- $\Pr[\text{random_number} \text{ being a multiple of } 283 \cdot 353]$

$\Pr[\gcd(\text{random_number}, x) \neq 1]$
= $(353 + 283 - 1) / 100000 = 0.00635$

With probability $1 - 0.00635 = 0.99365$ the algorithm fails.

If run 100 times, you get $0.99365^{100} = 0.53$ failure rate.

If run 1000 times, you get $0.99365^{1000} = 0.002$ failure rate.

```
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2 import java.util.concurrent.ThreadLocalRandom;
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4 public class prime {
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In Class Exercise



https://n.ethz.ch/~ahmala/anw/material/Broken_Servers.pdf

You are in a network of n servers, numbered from 1 to n .

Every server can be contacted in $O(1)$.

If the server is damaged, sends an i.i.d. bit

If the server is undamaged, sends always the same bit

a) Let $\delta > 0$. Describe a Monte Carlo Algorithm finding out if server i is damaged.
Make sure Error Probability is $\leq \delta/N$

b)

- If a server is damaged, does the algorithm from a) find it?
- If a server is undamaged, does the algorithm from b) find it?
- When the algorithm returns “Server is damaged”, is it always correct?
- When the algorithm returns “Server is undamaged”, is it always correct?

c)

- Given δ , describe a Monte Carlo Algorithm returning the list of damaged servers with error probability $\leq \delta$.

Fermat

$$n \text{ is prime} \implies \forall a \in \{1, \dots, n-1\} : a^{n-1} \equiv_n 1$$

Example:

$$6^{12} = 1 \bmod 13$$

$$4^4 = 1 \bmod 5$$

Fermat

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Example:

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Primality Tests II - Using Fermat

```
1 Choose  $1 < a < n$  uniformly at random
2 if  $a^{n-1} \not\equiv_n 1$ 
3     return "not prime"
4 else
5     return "prime"
```

Primality Tests II - Using Fermat

```
1 Choose  $1 < a < n$  uniformly at random
2 if  $a^{n-1} \not\equiv_n 1$ 
3     return "not prime"
4 else
5     return "prime"
```

Does it have one-sided error?

Primality Tests II - Using Fermat (success prob of min 0.5)

```
1 Choose  $1 < a < n$  uniformly at random
2 if  $a^{n-1} \not\equiv_n 1$ 
3   return "not prime"
4 else
5   return "prime"
```

Let's consider $n = 561 = 3 \cdot 11 \cdot 17$

$$4^{560} = 1 \pmod{561}$$

$$7^{560} = 1 \pmod{561}$$

For all b relatively prime to n , we get $b^{n-1} = 1 \pmod{n}$.

Primality Tests III - Miller Rabin (success prob of min 0.75)

n is prime $\Rightarrow$ the equation $(x^2 = 1 \bmod n)$ has exactly the solutions 1 and $n - 1$

```
1 Write  $n - 1$  as  $2^k \cdot d$  with  $d$  odd
2 Choose  $1 < a < n$  uniformly at random
3 if  $a^d \not\equiv_n 1$ 
4   for  $i = 1, \dots, k$  do
5     if  $a^{2^{i-1} \cdot d} \equiv_n n - 1$ 
6       return "prime"
7   return "not prime"
8 else
9   return "prime"
```

Hard DP+Probability Problem



<https://n.ethz.ch/~ahmala/anw/tasks/Taking%20Balls.pdf>