

1 Asymptotics is Fun!

- (a) Using the function `g` defined below, what is the runtime of the following function calls? Write each answer in terms of `N`.

```
1 void g(int N, int x) {
2     if (N == 0) {
3         return;
4     }
5     for (int i = 1; i <= x; i++) {
6         g(N - 1, i);
7     }
8 }
```

`g(N, 1): $\Theta(\quad)$`

`g(N, 2): $\Theta(\quad)$`

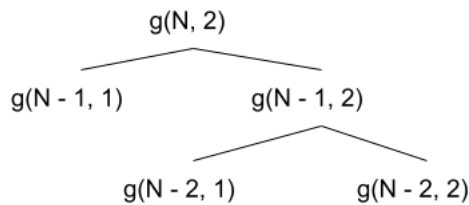
Solution:

`g(N, 1): $\Theta(N)$`

Explanation: When `x` is 1, the loop gets executed once and makes a single recursive call to `g(N - 1)`. The recursion goes `g(N)`, `g(N - 1)`, `g(N - 2)`, and so on. This is a total of `N` recursive calls, each doing constant work.

`g(N, 2): $\Theta(N^2)$`

Explanation: When `x` is 2, the loop gets executed twice. This means a call to `g(N)` makes 2 recursive calls to `g(N - 1, 1)` and `g(N - 1, 2)`. The recursion tree looks like this:



From the first part, we know `g(..., 1)` does linear work. Thus, this is a recursion tree with `N` levels, and the total work is $(N-1) + (N-2) + \dots + 1 = \Theta(N^2)$ work.

- (b) Suppose we change line 6 to `g(N - 1, x)` and change the stopping condition in the for loop to `i <= f(x)` where `f` returns a random number between 1 and `x`, inclusive. For the following function calls, find the tightest Ω and big O bounds.

```

1 void g(int N, int x) {
2     if (N == 0) {
3         return;
4     }
5     for (int i = 1; i <= f(x); i++) {
6         g(N - 1, x);
7     }
8 }

```

$g(N, 2): \Omega(\quad), O(\quad)$

$g(N, N): \Omega(\quad), O(\quad)$

Solution:

$g(N, 2): \Omega(N), O(2^N)$

$g(N, N): \Omega(N), O(N^N)$

Explanation: Suppose $f(x)$ always returns 1. Then, this is the same as case 1 from (a), resulting in a linear runtime.

On the other hand, suppose $f(x)$ always returns x . Then $g(N, x)$ makes x recursive calls to $g(N - 1, x)$, each of which makes x recursive calls to $g(N - 2, x)$, and so on, so the recursion tree has $1, x, x^2 \dots$ nodes per level. Outside of the recursion, the function g does x work per node. Thus, the overall work is $x * 1 + x * x + x * x^2 + \dots + x * x^{N-1} = x(1 + x + x^2 + \dots + x^{N-1})$.

Plug in $x = 2$ to get $2(1 + 2 + 2^2 + \dots + 2^{N-1}) = O(2^N)$ for our first upper bound. Plug in $x = N$ to get $N(1 + N + N^2 + \dots + N^{N-1}) = O(N^N)$ (ignoring lower-order terms).

2 Flip Flop

Suppose we have the `flip` function as defined below. Assume the method `unknown` returns a random integer between 1 and N , exclusive, and runs in constant time. For each definition of the `flop` method below, give the best and worst case runtime of `flip` in $\Theta(\cdot)$ notation as a function of N .

```

1 public static void flip(int N) {
2     if (N <= 100) {
3         return;
4     }
5     int stop = unknown(N);
6     for (int i = 1; i < N; i++) {
7         if (i == stop) {
8             flop(i, N);
9             return;
10        }
11    }
12 }

```

(a) `public static void flop(int i, int N) {`
`flip(N - i);`
`}`

Best Case: $\Theta(\quad)$, Worst Case: $\Theta(\quad)$

Solution:

Best Case: $\Theta(N)$, Worst Case: $\Theta(N)$

Explanation: Consider some arbitrary value of `stop`. When `stop = x`, we do x work inside of `flip` (the for loop) and recursively call `flip(N - x)` through `flop`. This results in a total of N / x calls before reaching our base case, and x work per call, for a total of $\Theta(N)$ work. Note that this holds for any value of x , so our best and worst case are the same.

```

(b) public static void flop(int i, int N) {
    int minimum = Math.min(i, N - i);
    flip(minimum);
    flip(minimum);
}

```

Best Case: $\Theta(\quad)$, Worst Case: $\Theta(\quad)$

Solution:

Best Case: $\Theta(1)$, Worst Case: $\Theta(N \log N)$

Explanation: In the best case, `stop = 1`. This hits the base case immediately, so we make 2 calls to `flip` then stop for $\Theta(1)$ work.

In the worst case, `stop = N / 2`. This results in `flip` making 2 recursive calls to itself with the argument $N / 2$. Note the similarity of this recurrence and mergesort; the runtime is the same $\Theta(N \log N)$.

```
(c) public static void flop(int i, int N) {  
    flip(i);  
    flip(N - i);  
}
```

Best Case: $\Theta(\quad)$, Worst Case: $\Theta(\quad)$

Solution:

Best Case: $\Theta(N)$, Worst Case: $\Theta(N^2)$

Explanation: In the best case, suppose `stop = 1`. Then `flip(N)` makes recursive calls to `flip(1)` and `flip(N - 1)`, the first of which terminates immediately in the base case. `flip(N - 1)` then calls `flip(1)` and `flip(N - 2)`. The pattern is a linear recursion: constant work per call, N calls total for $\Theta(N)$ work.

In the worst case, suppose `stop = N - 1`. Note that this case is symmetrical to the best case in terms of recursive calls; however we do work proportional to N inside of `flip` each time because of the `for` loop. The overall work is $(N - 1) + (N - 2) + (N - 3) + \dots + 2 + 1 = \Theta(N^2)$.

3 Prime Factors

Determine the best and worst case runtime of `prime_factors` in $\Theta(\cdot)$ notation as a function of N .

```

1  int prime_factors(int N) {
2      int factor = 2;
3      int count = 0;
4      while (factor * factor <= N) {
5          while (N % factor == 0) {
6              System.out.println(factor);
7              count += 1;
8              N = N / factor;
9          }
10         factor += 1;
11     }
12     return count;
13 }
```

Best Case: $\Theta(\quad)$, Worst Case: $\Theta(\quad)$

Solution:

Best Case: $\Theta(\log(N))$, Worst Case: $\Theta(\sqrt{N})$

Explanation: In the best case, N is some power of 2. Then the inner while loop will halve N each time until it becomes 1. At this point, both the inner and outer while loop conditions will be false and the function will return. Halving N each time results in a $\Theta(\log N)$ runtime.

In the worst case, N will not be divisible by any value of `factor`. This means we increment `factor` by 1 each time until `factor * factor > N`. This is at most \sqrt{N} loops.