

# CSE 373: Asymptotic Analysis

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## Warmup

Remind your neighbor: what fields did our array list iterator need?

## Comparing algorithms

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- ▶ Memory used
- ▶ Number of network calls made
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Today: focus on comparing algorithms based on *how long it takes them to run in the worst case*.

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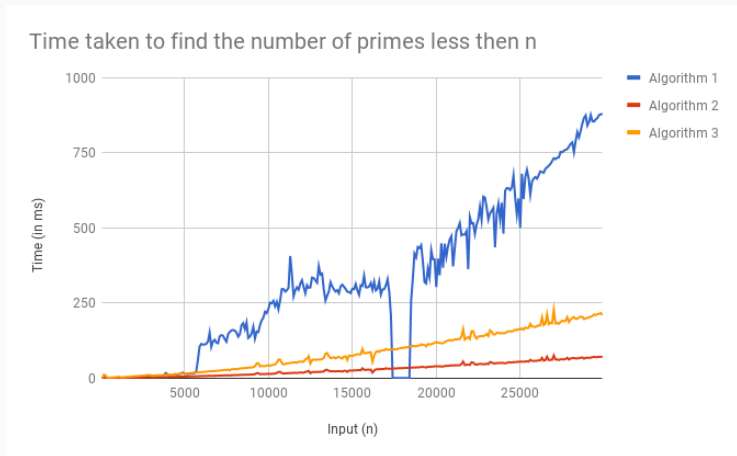
### **Time taken for $n = 18000$**

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This is a trick question. Why isn't this table enough to let us decide which algorithm is better?

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# Our goal

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(what if we miss worst-case input? best-case input?)
- ▶ A way to analyze before coding!

Two step process:

1. **Model** what we care about as a mathematical function
2. **Analyze** that function using asymptotic analysis



# Modeling: Assumptions

Assumption: basic operations take “constant” time

- ▶ Arithmetic (for fixed-width numbers)
- ▶ Variable assignment
- ▶ Accessing a field or array index
- ▶ Printing something out
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Warning: These assumptions are over-simplifications.

But they're very useful approximations!

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Sum of time of each statement

# Modeling: Complex statements

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- ▶ **Loops**

Number of iterations  $\times$  time for loop body

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Algorithm 1: compare each pair of elements

```
public boolean hasDuplicate1(int[] array) {
    for (int i = 0; i < array.length; i++)
        for (int j = 0; j < array.length; j++)
            if (i != j && array[i] == array[j])
                return true;
    return false;
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Algorithm 2: compare each consecutive pairs of elements

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public boolean hasDuplicate2(int[] array) {
    for (int i = 0; i < array.length - 1; i++)
        if (array[i] == array[i + 1])
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Exercise: create a **mathematical function** modeling the amount of time taken in the worst case

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1. **Model** what we care about as a mathematical function
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Specifically: have a way to **compare** two functions

Next time: how do we compare functions?