

- Last time
 - Review induction proofs
 - Loop invariants
 - Review notations in Discrete Math (read notes)
- Today
 - Basic algorithmics notations
 - Asymptotic Notation

Elementary Algorithmics

- Given a problem
 - What's an instance
 - Instance size
- What does efficiency mean?
 - Time
 - Space

Instance of a problem

- Instance: problem + input
- Problem: calculate Fibonacci(n)
 - Fibonacci(45) is an *instance* of the problem
- *Domain of definition* of a problem: the set of instances to be considered
 - A correct algorithm should work for every instance

Efficiency of an algorithm

- Efficiency
 - **Time**, space, energy
 - Measured as a function of the size of the instances considered
- Size
 - The *size* of an instance corresponds formally the number of the bits needed to represent the instance on a computer
 - A less formal definition: any integer that in some way measures the number of components in an instance
 - For example, sorting, graphs
 - For problems involving integers, we use *value* rather than size

Approaches to measure efficiency

- Empirical Approach
 - Experiments through limited instances
- Theoretical Approach (one focus of this course)
 - Determines mathematically the quantity of resources needed by an algorithm
- Hybrid approach
 - Given an implementation in a machine, predict the efficiency of an instance using limited experiments

Principle of Invariance

- How to measure efficiency in terms of time—
What's a unit we choose: second, minute, cycle
- Answer theoretically: Principle of Invariance
 - If two implementations of an algorithm take $t_1(n)$ and $t_2(n)$ seconds, respectively, to solve an instance of size n , then there always exist positive constants c and d such that $t_1(n) \leq c \cdot t_2(n)$ and $t_2(n) \leq d \cdot t_1(n)$, whenever n is sufficiently large
 - Allows us to express the theoretical efficiency of an algorithm without considering the unit
 - Express the time “in the order of $t(n)$ ”
- Asymptotic notation

Average and worst-case analysis

- How to compare two algorithms
 - Worst case, average, best-case
- Worst case
 - Appropriate for an algorithm whose response time is critical
- Average
 - For an algorithm which is to be used many times on many different instances
 - Harder to analyze, need to know the distribution of the instances
- Best case

Elementary Operation

- An elementary operation is one whose execution time can be bounded above by a constant depending only on the particular implementation—the machine, the programming language, etc.
- Example
 - $X = \text{Sum}\{A[i] \mid 1 \leq i \leq n\}$
 - Fibonacci sequence, addition may not be an elementary operation

Insertion sort vs. Selection sort

```
void insertionSort(int A[], int n)
{
    int i, j, tmp;

    for (i=1; i<n; i++) {
        tmp=A[i];
        j = i-1;
        while (j>=0 && tmp<A[j]) {
            A[j+1] = A[j];
            j--;
        }
        A[j+1] = tmp;
    }
}
```

```
int selectionSort(int A[], int n)
{
    int i, j, minj, minv;

    for (i=0; i<n-1; i++) {
        minj=i; minv=A[i];
        for (j=i+1; j<n; j++) {
            if (A[j]<minv) {
                minv = A[j];
                minj = j;
            }
        }
        A[minj] = A[i];
        A[i] = minv;
    }
}
```

For best-case and worst-case, consider:

- A is in ascending order
- A is in descending order

A detailed worst-case analysis of selection sort

```
int selectionSort(int A[], int n)
{
    int i, j, minj, minv;

    for (i=0; i<n-1; i++) {
        minj=i; minv=A[i];
        for (j=i+1; j<n; j++) {
            if (A[j]<minv) {
                minv = A[j];
                minj = j;
            }
        }
        A[minj] = A[i];
        A[i] = minv;
    }
}
```

Assumption!

First time 3, later 2
1 + 2
First time 3, later 2
2
2
1

n-1 times
n-i-1 times

Total elementary operations:

$$1 + \sum_{i=0}^{n-2} (2 + 3 + 3 + 2 + 1) + \sum_{j=i+1}^{n-1} (2 + 2 + 2 + 1) = 1 + \sum_{i=0}^{n-2} (11 + \sum_{j=i+1}^{n-1} 7) = \frac{7}{2}n^2 - \frac{1}{2}n - 2$$