

# Introduction to Algorithms and Data Structures

## Lesson 2: Foundation of Algorithms (2) Simple Basic Algorithms

Professor Ryuhei Uehara,  
School of Information Science, JAIST, Japan.

[uehara@jaist.ac.jp](mailto:uehara@jaist.ac.jp)

<http://www.jaist.ac.jp/~uehara>

# Algorithm?

- Algorithm: abstract description of how to solve a problem (by computer)
  - It returns correct answer for any input
  - It halts for any input
  - Description is not ambiguity
    - (operations are well defined)
- Program: description of algorithm by some computer language
  - (Sometimes it never halt)



Al-Khwarizmi

# Design of Good Algorithm

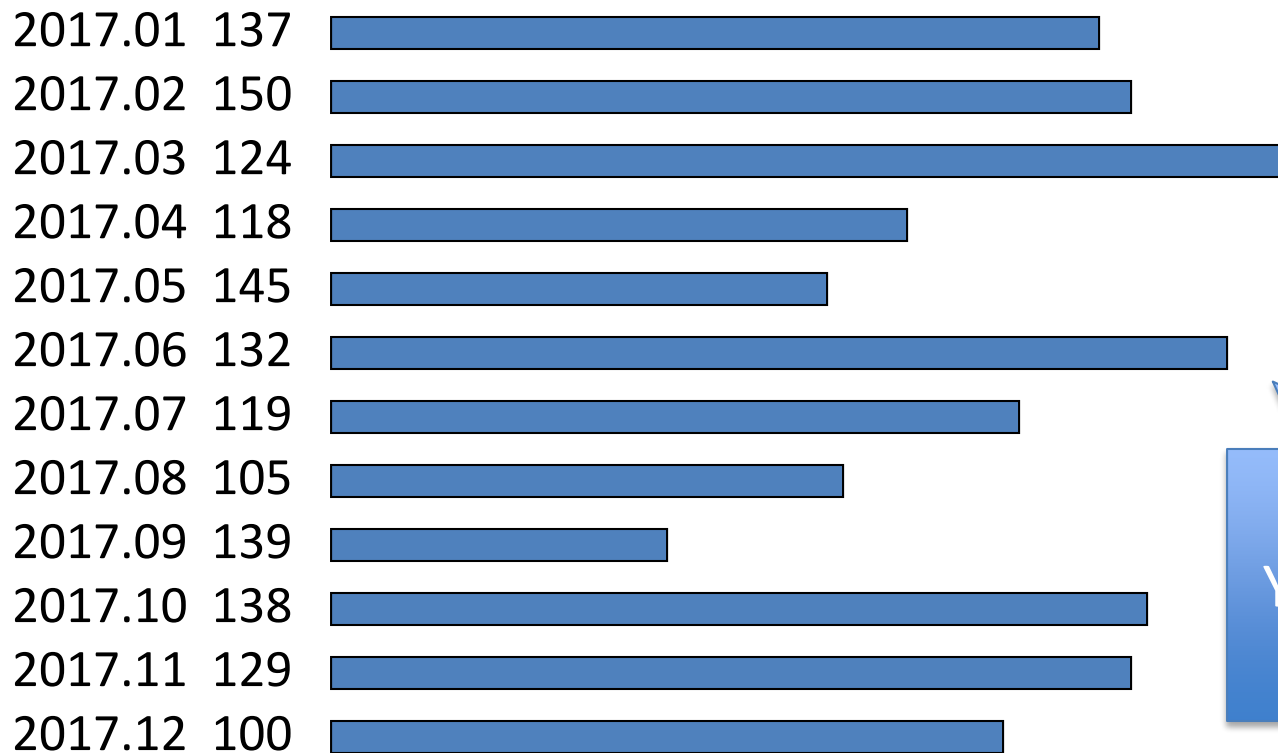
- There are some design method
- Estimate time complexity (running time) and space complexity (quantity of memory)
- Verification and Proof of Correctness of Algorithm
  
- Bad algorithm
  - Instant idea: No design method
  - Just made it: No analysis of correctness and/or complexity

# Simple example and algorithm

- Stock trading algorithm
  - Goal: Maximize your benefit
    - Naïve method
    - Some improvements
    - More improvement: from  $O(n^2)$  to  $O(n)$

# Stok trading (maximize benefit)

- You would buy **once** and sell **once**. Can you find the maximum benefit?



Note:  
You cannot sell  
before buy!!

# Formalization of the problem

- `int sp[n]`: array of stock prices (e.g.  $n=12$ )
- When you buy at month  $i$  and sell at month  $j$ 
  - buy: `sp[i]`
  - sell: `sp[j]`
  - benefit: `sp[j] - sp[i]`
- Goal: maximize `sp[j]-sp[i]`  
That is, compute the following;  
$$\max\{sp[j] - sp[i] \mid 0 \leq i < j < n\}$$

# Outline of algorithms

- Method A

```
for i=0 to n-2
  for j=i+1 to n-1
    find benefit sp[j]-sp[i]
```

- Method B:

```
for j=1 to n-1
  for i=0 to j-1
    find benefit sp[j]-sp[i]
```

# Algorithm based on method A

- Is the following algorithm **efficient**?

```
MaxBenefit(sp[],n){/*sp[0]...sp[n-1]*/  
  mxp=0; /*Maximum benefit*/  
  for i=0 to n-2  
    for j=i+1 to n-1  
      d = sp[j] - sp[i]; /*benefit*/  
      if d > mxp then mxp = d;  
      /*Update max. benefit*/  
    endfor  
  endfor  
  return mxp;  
}
```



# Algorithm based on method A

- Is the following algorithm **efficient**?

```
MaxBenefit(sp[],n){/*sp[0]...sp[n-1]*/  
  mxp=0; /*Maximum benefit*/  
  for i=0 to n-2  
    for j=i+1 to n-1  
      d = sp[j] - sp[i]; /*benefit*/  
      if d > mxp then mxp = d;  
      /*Update max. benefit*/  
    endfor  
  endfor  
  return mxp;  
}
```

For fixed  $i$ , benefit is maximum when  $sp[j]$  is maximum  
→ We don't need to compute  $sp[j]-sp[i]$  every time

# Algorithm based on method A (Improved)

```
MaxBenefit(sp[],n){ /*sp[0]...sp[n-1]*/  
  mxp=0; /* Maximum benefit */  
  for i=0 to n-2  
    mxsp = sp[i];  
    for j=i+1 to n-1  
      if sp[j] > mxsp then mxsp = sp[j];  
    endfor  
    d = mxsp - sp[i];  
    if d > mxp then mxp = d;  
  endfor  
  return mxp;  
}
```

mxsp: maximum trade

Subtraction is out of loop

# Outline of algorithms

- Method A

```
for i=0 to n-2
  for j=i+1 to n-1
    find benefit sp[j]-sp[i]
```

- Method B:

```
for j=1 to n-1
  for i=0 to j-1
    find benefit sp[j]-sp[i]
```

# Algorithm based on method B

```
MaxBenefit(sp[],n){ /*sp[0]...sp[n-1]*/  
  mxp=0; /* Maximum benefit */  
  for j=1 to n-1  
    mns = sp[j];  
    for i=0 to j-1  
      if sp[i] < mns then mns = sp[i];  
    endfor  
    d = sp[j] - mns;  
    if d > mxp then mxp = d;  
  endfor  
  return mxp;  
}
```

mns: cheapest stock price

# Efficiency of algorithms

- Number of loops (or repeating)
  - Method (A): number of loops is  $O(n^2)$

$$\sum_{i=0}^{n-2} \sum_{j=i+1}^{n-1} 1 = \sum_{i=0}^{n-2} (n-1-i) = \frac{n^2 - n}{2} \leq n^2/2$$

- Method (B): number of loops is  $O(n^2)$

$$\sum_{j=1}^{n-1} \sum_{i=0}^{j-1} 1 = \sum_{j=1}^{n-1} j = \frac{n^2 - n}{2} \leq n^2/2$$

Maybe tomorrow?

Notation that proportion to  $n^2$

**Q. Can we decrease them?**

# More improvement of algorithms; decreasing the number of loops

- Consider the second loop
  - Method A:
    - $\text{MAX}[i, n-1]$  is the maximum between time  $i$  and time  $n-1$
    - It computes in order  $\text{MAX}[1, n-1], \text{MAX}[2, n-1], \dots$

Q: can we compute  $\text{MAX}[i, n-1]$  from  $\text{MAX}[i-1, n-1]$ ?

**NO!**

- Method B:
    - $\text{MIN}[\theta, j-1]$  is the minimum between time  $\theta$  to time  $j-1$
    - It computes in order  $\text{MIN}[\theta, \theta], \text{MIN}[\theta, 1], \dots$
- Q: can we compute  $\text{MIN}[\theta, j]$  from  $\text{MIN}[\theta, j-1]$ ?

**YES!**  $\text{MIN}[\theta, j] = \min(\text{MIN}[\theta, j-1], \text{sp}[j])$

# Algorithm based on method B

```
MaxBenefit(sp[],n){ /*sp[0]..
  mxp=0; /* Maximum benefit
  for j=1 to n-1
    mnsf = sp[j];
    for i=0 to j-1
      if sp[i] < mnsf then mnsf = sp[i];
    endfor
    d = sp[j] - mnsf;
    if d > mxp then mxp = d;
  endfor
  return mxp;
}
```

- When  $j=k$ :  
mnsf is the minimum between  $sp[0]$  to  $sp[k-1]$
- When  $j=k+1$ :  
mnsf is the minimum between  $sp[0]$  to  $sp[k]$



We can keep mnsf, the minimum when  $j=k$ , and use it; when  $j=k+1$ , the minimum is the smaller one of mnsf and  $sp[k]$ .

# Efficient algorithm

- Algorithm that runs in  $O(n)$  time

```
MaxBenefit(sp[],n){ /*sp[0]...sp[n-1]*/
  mxp=0; /* Maximum benefit */
  msf = sp[0]; /* Cheapest value so far */
  for j=1 to n-1
    d = sp[j] - msf;
    if d > mxp then mxp = d;
    if sp[j] < msf then msf = sp[j];
  endfor
  return mxp;
}
```