# Dynamic programming

beOl 2015 Carnival Training
Day 2 - Floris Kint

Notes: http://bit.ly/1CLLzQr

# Key principle

Don't do anything stupid

Don't do anything twice

#### Ex 1: Fibonacci numbers

```
int fibo(int n)
    if(n==0)
        return 0;
    else if(n==1)
        return 1:
    else
        return fibo(n-1) + fibo(n-2);
```

Time complexity: O(2<sup>n</sup>)
Space complexity (stack): O(n)

#### Ex 1: Fibonacci numbers

```
int fibo(int n)
    vector<int> f;
    f.push_back(0);
    f.push_back(1);
    for(int i=2; i<=n; i++)
        f.push_back(f[i-1] + f[i-2]);
    return f[n];
```

Time complexity: O(n)
Space complexity: O(n)

# Ex 2: Longest Increasing subsequence

```
int lis(vector<int> &a, int min_value, int start_index)
  int best = 0;
  int smallest_found = 999999999;
  for(int i = start_index; i < a.size(); ++i)
    if(a[i] > min_value && a[i] < smallest_found)</pre>
      best = max(best, 1+lis(a, a[i], i+1));
      smallest_found = a[i];
  return best;
```

Time complexity: very bad

## Ex 2: Longest increasing subsequence

```
int lis(vector<int> a)
  int n = a.size();
  vector<int> ending_with;
  for(int i=0; i<n; i++)
    ending_with.push_back(0);
  int best = 0;
  for(int i=0; i<n; i++)
    for(int j=0; j < a[i]; j++){
      ending_with[a[i]] = max(ending_with[a[i]], ending_with[j]+1);
      best = max(best, ending_with[a[i]]);
  return best;
```

#### Time complexity: O(N^2)

### Ex 2: Longest increasing subsequence

```
vector<int> lis(vector<int> a)
  int L=1; // Longest so far
  vector<int> smallest_end_for;
  smallest_end_for.push_back(-1);
  smallest_end_for.push_back(0);
  for(int i=1; i<a.size(); i++)
    // Binary search for the best length before a[i]
    int lower=0, upper=L+1;
    while(lower+1 < upper)
      int middle = (lower+upper)/2;
      if(a[smallest_end_for[middle]] < a[i])
        lower = middle;
      else
        upper = middle;
```

```
int prev_len = lower;
  // If the length is the best so far
  if(prev_len + 1 > L)
    smallest_end_for.push_back(i);
    L++:
  // If this value is the new smallest for this length
  else if(a[i] < a[smallest_end_for[prev_len+1]])
    smallest_end_for[prev_len+1] = i;
return L:
```

#### Time complexity: O(N\*log(N))

### **Approaches**

#### Top-down (lazy approach)

If not previously calculated: calculate & store Use stored solution

#### Bottom-up

Build table of solutions from small to large, each time using the solutions of smaller problems

#### 2-Dimensional DP

#### Cheapest way to go right/down.

1	2	1	3
5	1	10	8
3	12	1	8
13	5	3	2

1 (1)	2 (3)	2 (5)	3 (8)
5 (6)	1 (4)	10 (14)	8 (16)
3 (9)	12 (16)	1 (15)	8 (23)
13 (32)	5 (21)	3 (18)	2 (20)

### 2-Dimensional DP: Top-down

```
int cheapest(int row, int col){
^{2}
      if(row == 0 \&\& col == 0)
       return grid [0][0];
      if (calculated [row] [col]==-1){
5
        if(row == 0)
          calculated [row] [col] = grid [row] [col] + cheapest (
              row, col -1);
        else if (col = 0)
          calculated [row] [col] = grid [row] [col] + cheapest (
             row-1, col);
        else
10
          calculated [row] [col] = grid [row] [col] + min(
              cheapest (row -1, col), cheapest (row, col -1);
11
12
     return calculated [row] [col];
13
```

### 2-Dimensional DP: Bottom-up

```
int cheapest (int row, int col) {
2
       calculated [0][0] = grid [0][0];
       for (int c = 1; c \ll col; ++c)
          calculated [0][c] = calculated [0][c-1]+grid [0][c];
5
       \mathbf{for}(\mathbf{int} \ \mathbf{r} = 1; \ \mathbf{r} \le \mathbf{row}; ++\mathbf{r})
6
          calculated [r][0] = calculated [r-1][0] + grid [r][0];
7
       \mathbf{for}(\mathbf{int} \ \mathbf{r} = 1; \ \mathbf{r} \le \mathbf{row}; ++\mathbf{r})
          for (int c = 1; c \ll col; ++c)
            calculated [r][c] = grid[r][c] + min(calculated[r
9
                 -1[c], calculated [r][c-1]);
       return calculated [row] [col];
10
```

### How to recognize

Knapsack
Sequences (common, increasing...)
Divide and Conquer

# **Applications**

Floyd-Warshall Bellman-Ford

### Exercises