

Dynamic Programming Ruby

Dynamic Programming: a class / type of algorithm, can be used to solve certain types of problems.

- 2 main properties for problems to be solved in dynamic programming approach:
- ↳ Optimal Substructure
 - ↳ Overlapping Subproblems

4 steps

- 1) Recurrence Relation: a relation that repeats itself. (= ~ Recursion)
 - 2) Top down: Solve problem from a global solution, then breaking it down into smaller ones, finding solutions to each of them until we got a global one.
 - 3) Bottom up: Find solutions of all small sub problems then build a global one.
 - 4) Optimize: find ways to optimize the btm-up solution so that we have a more efficient solution in terms of memory & runtime performance.
- ↳ steps ① & ② to check if a problem has an optimal substructure or overlapping sub problems.

- Recursion *

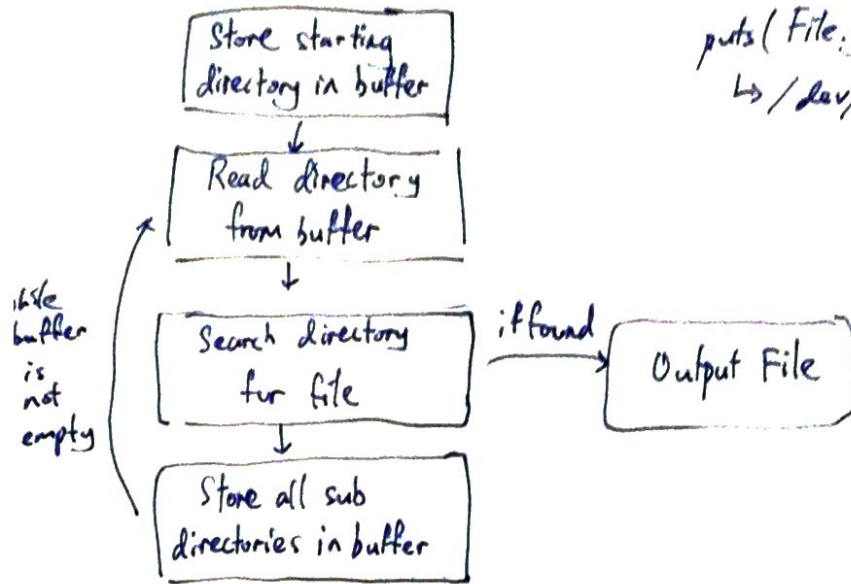
- ↳ Recursive function: A function that calls itself until it hits a stopping condition (base case).
- ↳ 2 main examples: Factorial & Fibonacci numbers (but not practical in workplace)
- ↳ 2 other practical examples: countdown timer & writing a file search in a directory.

CountDown Timer:

```
def countdown(n)
  return if n < 0
  puts(n)
  sleep(1)
  countdown(n-1)
end
```

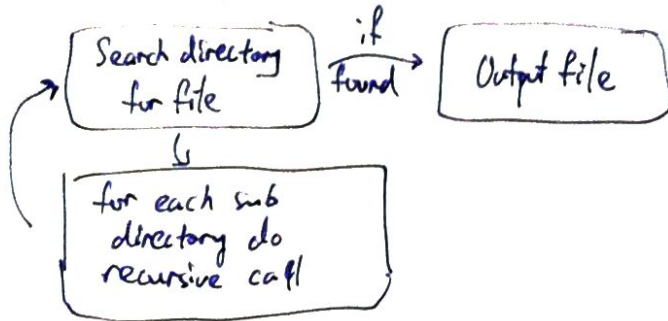
(readme.txt)
Eg. Search file in Folders (eg. /dev)

- non-recursive manner :



- Join 2 string together `"/dev/readme.txt"` by
`puts(File.join("/dev", "readme.txt"))`
↳ `/dev/readme.txt`

- Recursive Approach :



5) Counting Derangements

6) Coming up with a Recurrence Relation

- ↳ Try to express solution recursively
- ↳ Check whether our function satisfies the optimal substructure condition
- ↳ Start from base, move to general

7) Recursive code walkthrough

```
class CountDerangementsRec
    def initialize(set_size)
        @set_size = set_size
    end
    def count_derangements(n = @set_size)
        if n == 1
            0
        elsif n == 2
            1
        else
            (n-1) * (count_derangements(n-1) + count_derangements(n-2))
        end
    end
end

for i in 1..64
    result = CountDerangementsRec.new(i).count_derangements
    puts("Derangements in set size %d -> %d" % [i, result])
end
```

↳ but performing poorly, doesn't scale very well for large inputs.

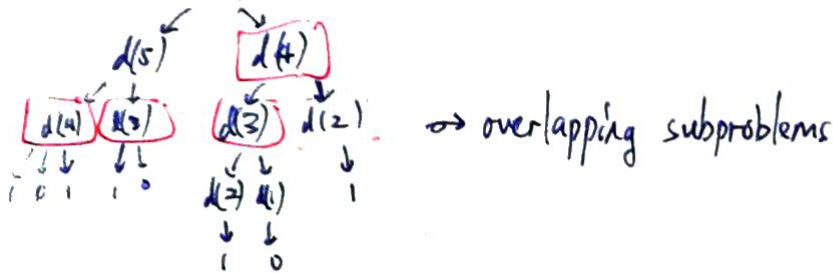
8) Top Down solution \rightarrow solving dynamic programming using temporary space

$$d(n) = \begin{cases} 0 & \text{if } n=1 \\ 1 & \text{if } n=2 \\ (n-1)(d(n-1) + d(n-2)) \end{cases}$$

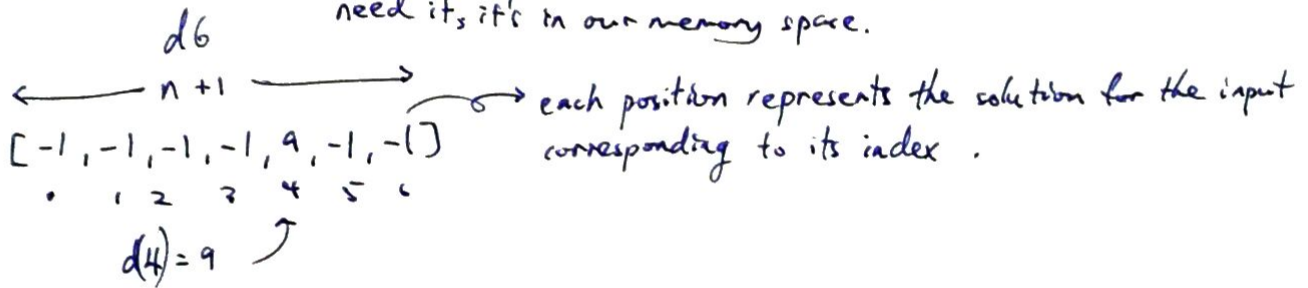
\rightarrow to use a diff. algorithm so we can optimize that & compute the current arrangements in a much more efficient manner.

- Draw a tree of all diff. recursive calls that we had in brute force algo.
eg. If brute force n=6:

$$d(6) \rightarrow 5 \times 5 = 25$$



To Use memoization, once we store solution, it never times out, use it whenever we need it, it's in our memory space.



9) Top-down code walkthrough

```
class CountDerangementsTopDown
  def initialize(set_size)
    @set_size = set_size
    @sub_solutions = Array.new(set_size + 1, -1)
  end
  def count_derangements(n = @set_size)
    if @sub_solutions[n] != -1
      @sub_solutions[n]
    elsif n == 1
      0
    elsif n == 2
      1
    elsif
      result = (n+1) * (count_derangements(n-1) + count_derangements(n-2))
      @sub_solutions[n] = result
    end
  end
end
```

\rightarrow initialize with -1


```

for i in 1..64
  n = CountDerangementsTopDown.new(i).count_derangements
  puts ("Derangements in set size %d → %d" % [i, n])
end

```

10) Bottom up Solution.

d(6)

← n+1 →

[-1, 0, 1, 2, 9, 44, 265]

0 1 2 3 4 5 6

→ → → 2(1+0) 3(2+0) 5(4+9) 4(9+2)

→

* need a space to store sub-solutions.

11) Btm up Code Walkthrough

```

class CountDerangementsBottomUp
  def initialize(set_size)
    @set_size = set_size
    @sub_solutions = Array.new(set_size + 1)
    for n in 1..@set_size
      if n == 1
        @sub_solutions[n] = 0
      elsif n == 2
        @sub_solutions[n] = 1
      else
        @sub_solutions[n] = (n - 1) * (@sub_solutions[n + 1] + @sub_solutions[n - 2])
      end
    end
  end

  def count_derangements
    @sub_solutions[@set_size]
  end
end

for i in 1..64
  n = CountDerangementsBottomUp.new(i).count_derangements
  puts ("Derangements in set size %d → %d" % [i, n])
end

```

12) Optimization & code walkthrough

↳ `CountDerangementsOpt`

```
def initialize(set_size)
```

```
    @set_size = set_size
```

```
    @solution_n = solution_n_minus_1 = solution_n_minus_2 = 0
```

```
    for n in 1..@set_size
```

```
        if n == 1
```

```
            @solution_n = 0
```

```
        elsif n == 2
```

```
            @solution_n = 1
```

```
        else
```

```
            @solution_n = (n-1)*(solution_n_minus_1 + solution_n_minus_2)
```

```
        end
```

```
        solution_n_minus_2 = solution_n_minus_1
```

```
        solution_n_minus_1 = @solution_n
```

```
    end
```

```
end
```

```
def count_derangements
```

```
    @solution_n
```

```
end
```

```
end
```

```
for i in 1..64
```

```
    n = CountDerangementsOpt.new(i).count_derangements
```

```
    puts "Derangements in set-size %d → %d" % [i, n]
```

```
end
```

└

13) Solving Air Traffic

- Given 7 aircrafts with diff. # of passengers, rule: try to
- Rule: Try to land as many passengers as possible; No two adjacent aircrafts can land after each other.
- * ~~as~~ first come first serve doesn't give the optimum solution.

14) Defining a solution recursively

[155, 55, 2, 96, 67, 203, 3]

- Recurrence Relation

↳ base case: max passengers = 0 if list == []

$$\max \begin{cases} 155 + \text{maxPass}([2, 96, 67, 203, 3]) \\ \text{maxPass}([55, 2, 96, 67, 203, 3]) \end{cases}$$

$$\text{maxPass}(0) = \max \begin{cases} 0 \text{ if list == []} \\ 0 + \text{maxPass}(2) \\ \text{maxPass}(1) \end{cases}$$

$$\text{maxPass}(i) = \max \begin{cases} 0 \text{ if list == []} \\ 0 \text{ if } i \geq \text{input length} \\ 0 + \text{maxPass}(i+2) \\ \text{maxPass}(i+1) \end{cases}$$

class AircraftSpacing Rec

def initialize(passengers)

@passengers = passengers

def max_passengers(i)

if i >= @passengers.length

0

choosing_first = @passengers[i] + max_passengers(i+2)

not_choosing_first = max_passengers(i+1)

[choosing_first, not_choosing_first].max

end
end
end

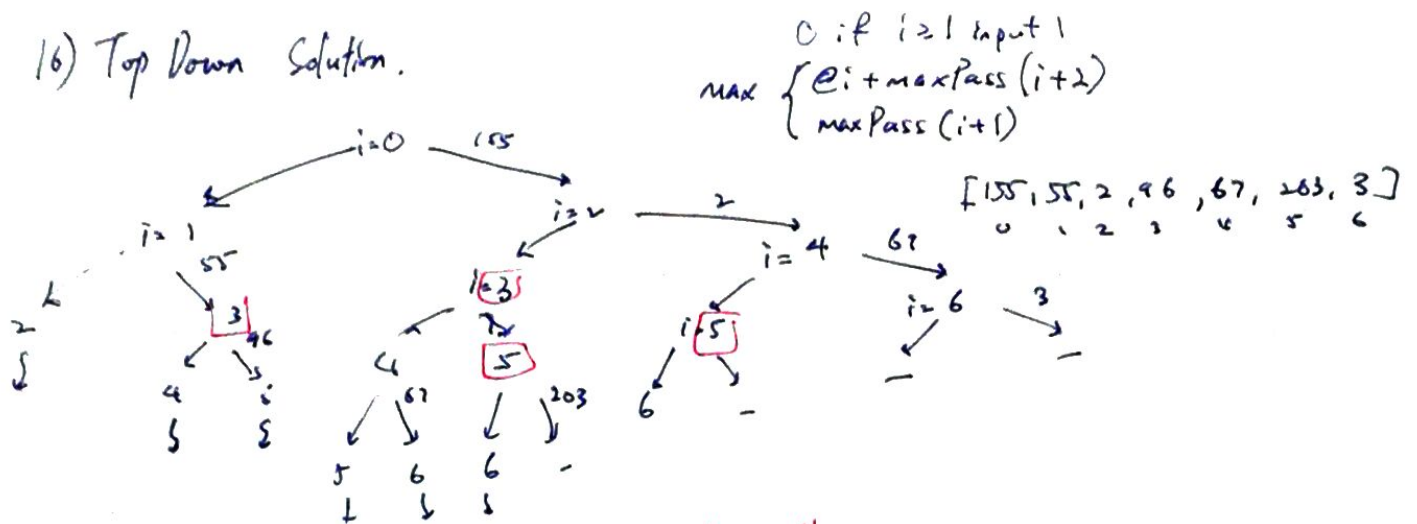
spacing = AircraftSpacing Rec.new([155, 5, 2, 96, 67, 203, 3])

puts(spacing.max_passengers(0))

↳ 454 ✓
first item of the list

↳ slow on big sample; doesn't scalable.

16) Top Down Solution.



we use memoization to store sub-results, so when you encounter again, you don't need to re-compute.

By initializing an array of -1 with same size of inputs, i.e.

$[-1, -1, -1, -1, -1, -1, -1]$ → indicate the sub-solution is empty.
 0 1 2 3 4 5 6
 203

17) Top Down code - walkthrough.

```
class AircraftSpacingTopDown
def initialize(passengers)
  @passengers = passengers
  @sub_solutions = Array.new(passengers.length, -1)
end

def max_passengers(i)
  if i >= @passengers.length
    0
  elsif @sub_solutions[i] != -1
    @sub_solutions[i]
  else
    choosing_first = @passengers[i] + max_passengers(i+2)
    not_choosing_first = max_passengers(i+1)
    max_pass = [choosing_first, not_choosing_first].max
    @sub_solutions[i] = max_pass
  end
end
end
```


spacing = AircraftSpacingTopDown.new([155, 55, 2, 96, 67, 203, 3])
 puts(spacing.max_passengers(0))

16) Bottom Up Approach

↳ Involves filling up memoization space with pre-computed values instead of filling them up as you go. We can fill it up before calling.

$$f(i) = \begin{cases} 0 & \text{if } i \geq \text{input} \\ \max \{ @i + \text{maxPass}(i+2) \\ \text{maxPass}(i+1) \} \end{cases}$$

At 5th,

$$f(5) = \max \begin{cases} @5 + \text{maxPass}(7) \\ \text{maxPass}(6) \end{cases}$$

$$= \max \begin{cases} 203 + 0 \\ 3 \end{cases} \rightarrow 203.$$

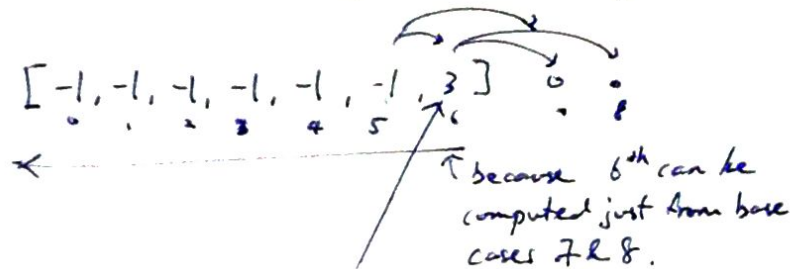
$$f(4) = \max \begin{cases} 67 + 3 \\ 203 \end{cases} \rightarrow 203$$

$$f(3) = \max \begin{cases} 96 + 203 \\ 203 \end{cases} \rightarrow 299$$

$$f(2) = \max \begin{cases} 2 + 203 \\ 299 \end{cases} \rightarrow 299$$

$$f(1) = \max \begin{cases} 155 + 299 \\ 299 \end{cases} \rightarrow 345$$

$$f(0) = \max \begin{cases} 155 + 299 \\ 345 \end{cases} \rightarrow \underline{\underline{454}}$$



$$= \max \begin{cases} @i + \text{maxPass}(i+2) \\ \text{maxPass}(i+1) \end{cases}$$

$$= \max \begin{cases} 3 + \text{maxPass}(8) \\ \text{maxPass}(7) \end{cases} = \max \begin{cases} 3 + 0 \\ 0 \end{cases} = 3.$$

[454, 345, 299, 299, 203, 203, 3]

19) Btm Up code walkthrough \Rightarrow gives us a glimpse into any possible optimization.

```
class AircraftSpacingBottomUp
  def initialize (passengers)
    @passengers = passengers
    @sub_solutions = Array.new (passengers.length - 1)
    for i in (@passengers.length - 1), down to 0
      choosing_first = @passengers[i] + (i + 2 < @sub_solutions.length ? @sub_solutions[i + 2] : 0)
      not_choosing_first = i + 1 < @sub_solutions.length ? @sub_solutions[i + 1] : 0
      @sub_solutions[i] = [choosing_first, not_choosing_first].max
    end
  end
  def max_passengers
    @sub_solutions[0]
  end
end

spacing = AircraftSpacingBottomUp.new([155, 55, 2, 96, 67, 203, 3])
puts (spacing.max_passengers)  $\Rightarrow$  454
```

20) \hookrightarrow drawback : consumes more memory than what's needed. (eg. for large inputs it need large area to store these substitutions.)

eg. for item 0, only require item 2 & 3, 4 - 6 are not needed.

solve : replace the entire $[\quad]$ w/ $i, i+1, i+2$. Initially,
 $i+1 \leq i+2 \leq 0$

20) Optimization (code)

```
class AircraftSpacingOpt
  def initialize(passengers)
    @passengers = passengers
    @sub_solution_i = sub_solution_i_plus_1 = sub_solution_1_plus_2 = 0
    for i in (@passengers.length - 1).downto(0)
      choosing_first = @passengers[i] + sub_solution_i_plus_2
      not_choosing_first = sub_solution_i_plus_1
      @sub_solution_i = [choosing_first, not_choosing_first].max
      sub_solution_i_plus_2 = sub_solution_i_plus_1
      sub_solution_i_plus_1 = @sub_solution_i
    end
  end
  def max_passengers
    @sub_solution_i
  end
end

spacing = AircraftSpacingOpt.new([155, 55, 2, 96, 67, 203, 3])
puts(spacing.max_passengers)
```

21) Maximum Sub Array

- How are maximum sub arrays useful?

subarray: a ^{continuous} portion of an original array; ~~*[]~~ is

*[] is subarray of every array.

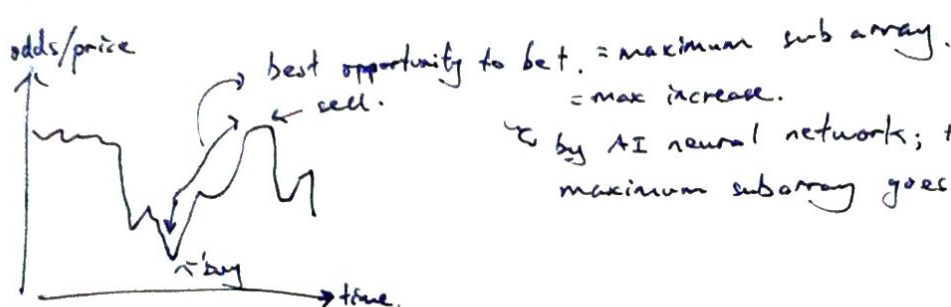
* Continuous

Maximum Sub Array:

↳ Given $[5, -4, 8, -10, -2, 4, -3, 2, 7, -8, 3, -5, 3]$, find the maximum sub array.

* It only make sense if it contains -ve & +ve numbers.

eg.



↳ by AI neural networks; there is when maximum subarray goes handy

22) Recurrence Relation. (Max Sub Array)

max sub array = eg. $[2, 3, -5]$

endingAt(i) - subarrays: $[-5], [3, -5], [2, 3, -5], [3], [2, 3], [2]$

$\underbrace{\hspace{10em}}_{\text{endingAt}(2) = 0} \quad \underbrace{\hspace{10em}}_{\text{endingAt}(1) = 5} \quad \underbrace{\hspace{10em}}_{\text{endingAt}(0) = 2}$

* include 0 i.e. []

0...n

→ n+1 if 0...n (n is exclusive)

∴ max subarray = max $\begin{cases} \text{endingAt}(n) \\ \dots \\ \text{endingAt}(0) \end{cases}$... inclusive

eg. $[5, -4, 8, -10, -2, 4, -3, 2, 7, -8, 3, -5, 3]$

0 1 2 3 4 5 6 7 8 9 10 11 12

@0
↑
...
↑
@4
max { @4 + endingAt(3) }

endingAt(5) = max sum $\begin{cases} [4] \\ [-2, 4] \\ [-10, -2, 4] \\ [8, -10, -2, 4] \\ [-4, 8, -10, -2, 4] \\ [5, -4, 8, -10, -2, 4] \end{cases}$ endingAt(4) = max sum $\begin{cases} @5 \\ @5 + \text{endingAt}(4) \end{cases}$

↑
@5

@0 if i == 0 → only if @0 ≥ 0

$$\therefore \text{endingAt}(i) = \max \begin{cases} @i \\ @i + \text{endingAt}(i-1) \end{cases}$$

23) Recursive code walkthrough - Max Sub Array.

0 ... n
[..., ..., ...]

$$\text{max sub array} = \max \begin{cases} \text{endingAt}(n) \\ \dots \\ \text{endingAt}(0) \end{cases}$$

```
class MaxSubArrayRec
  def initialize(prices)
    @prices = prices
  end
```

```
  def max_sub_array()
    max_value = 0
    for j in 0..@prices.length-1
      max_value = [max_value, max_sub_array_ending_at(j)].max
    end
```

→ In Ruby, loop is inclusive, ∴ -1

```
    max_value
  end
```

```
  def max_sub_array_ending_at(i)
```

```
    if i == 0
```

```
      @prices[0]
```

```
    else
```

```
      [@prices[i], max_sub_array_ending_at(i-1) + @prices[i]].max
```

```
    end
```

```
  end
```

```
end
```

```
msa = MaxSubArrayRec.new([5, -4, 8, -10, -2, 4, -3, 2, 7, -8, 3, -5, 3])
```

```
puts (msa.max_sub_array)
```

↳ 10

10

@0 if i == 0

$$\rightarrow \text{endingAt}(i) = \max \begin{cases} @i \\ @i + \text{endingAt}(i-1) \end{cases}$$

24) Top Down (Max Sub Array)

In initialize:

- @sub_solutions = Array.new (prices.length, nil)

In max_sub_array - ending_at(i):

- if @sub_solutions[i] != nil

@sub_solutions[i]

elsif i == 0

@prices[0]

else

m = [@prices[i], max_sub_array_ending_at(i-1) + @prices[i]].max

@sub_solutions[i] = m

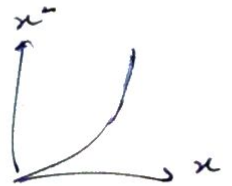
m

end.

27) Text Justification (Typographical alignment).

↳ Given a chunk of words, choose which words on which lines so the paragraph looks prettier.

↳ The ugly score, ↑ score = uglier, measured by spaces^2



class TextJustifyRec

def initialize(txt, line_length)

@txt = txt

@line_length = line_length

end

def ugly_score(txt_length)

if txt_length <= @line_length

(@line_length - txt_length) ** 2

else

Float::INFINITY

end

end

end