# CS 381 – FALL 2019

### Week 6.1, Wed, Sept 25

Practice Midterm 1: Solutions Released Midterm 1: September 25 (tonight)

## Announcements

No PSOs this week (due to Midterm)

Yes, we do have class today <sup>(2)</sup>
 Classes canceled on October 28<sup>th</sup> and Dec 6<sup>th</sup>
 Make up for two evening midterm exams
 Homework 3 solutions released on Piazza
 Submission server is closed for homework 3

## Midterm 1: Logistics

90 minutes (8:00-9:30PM)
 Tuesday/Thursday PSOs: SMTH 108 (Exam Capacity =115)
 Friday PSO: MTHW 210 (Exam Capacity = 111)

I Page of Handwritten Notes (Single-Sided)

- Standard paper (or A4) is acceptable
- Bring number 2 pencil (for scanned exam)

Closed book, no calculators, no smartphones, no smartwatches, no laptops etc...

# Midterm 1

#### Practice Midterm Solutions

- Advice: Try to solve each problem yourself before checking answers
- Topics:
  - Induction
  - Big-O
  - Divide and Conquer
    - Sorting, Counting Inversions, Maximum Subarray, Skyline Problem, Karatsuba Multiplication
  - Recurrences
    - Deriving a Recurrence
    - Unrolling
    - Recursion Trees
    - Master Theorem
  - Greedy Algorithms

No Dynamic Programming Required (until Midterm 2)

## 6.1 Weighted Interval Scheduling

### Weighted Interval Scheduling

### Weighted interval scheduling problem.

- Job j starts at  $s_j$ , finishes at  $f_j$ , and has weight or value  $v_j$ .
- Two jobs compatible if they don't overlap.
- . Goal: find maximum weight subset of mutually compatible jobs.



Unweighted Interval Scheduling (will cover in Greedy paradigms)

Previously Showed: Greedy algorithm works if all weights are 1.

• Solution: Sort requests by finish time (ascending order)

Observation. Greedy algorithm can fail spectacularly if arbitrary weights are allowed.



#### Weighted Interval Scheduling

Notation. Label jobs by finishing time:  $f_1 \le f_2 \le \ldots \le f_n$ . Def. p(j) = largest index i < j such that job i is compatible with j.

**Ex:** p(8) = 5, p(7) = 3, p(2) = 0.



Dynamic Programming: Binary Choice

Notation. OPT(j) = value of optimal solution to the problem consisting of job requests 1, 2, ..., j.

- Case 1: OPT selects job j.
  - collect profit v<sub>j</sub>
  - can't use incompatible jobs { p(j) + 1, p(j) + 2, ..., j 1 }
  - must include optimal solution to problem consisting of remaining compatible jobs 1, 2, ..., p(j)

optimal substructure

- Case 2: OPT does not select job j.
  - must include optimal solution to problem consisting of remaining compatible jobs 1, 2, ..., j-1

$$OPT(j) = \begin{cases} 0 & \text{if } j = 0\\ \max \{ v_j + OPT(p(j)), OPT(j-1) \} & \text{otherwise} \end{cases}$$

#### Brute force algorithm.

```
Input: n, s<sub>1</sub>,...,s<sub>n</sub>, f<sub>1</sub>,...,f<sub>n</sub>, v<sub>1</sub>,...,v<sub>n</sub>
Sort jobs by finish times so that f_1 \leq f_2 \leq \ldots \leq f_n.
Compute p(1), p(2), ..., p(n)
Compute-Opt(j) {
    if (j = 0)
        return 0
    else
        return max(v<sub>j</sub> + Compute-Opt(p(j)), Compute-Opt(j-1))
}
```

$$T(n) = T(n-1)+T(p(n))+O(1)$$
  

$$T(1) = 1$$
  
Reminder: p(n) = largest index i < n such  
that job i is compatible with job n.

Weighted Interval Scheduling: Brute Force

Observation. Recursive algorithm fails spectacularly because of redundant sub-problems  $\Rightarrow$  exponential algorithms.

Ex. Number of recursive calls for family of "layered" instances grows like Fibonacci sequence ( $F_n > 1.6^n$ ).



#### Weighted Interval Scheduling: Memoization

Memoization. Store results of each sub-problem in a cache; lookup as needed.

```
Input: n, s<sub>1</sub>,...,s<sub>n</sub>, f<sub>1</sub>,...,f<sub>n</sub>, v<sub>1</sub>,...,v<sub>n</sub>
Sort jobs by finish times so that f<sub>1</sub> \leq f<sub>2</sub> \leq ... \leq f<sub>n</sub>.
Compute p(1), p(2), ..., p(n)
for j = 1 to n
    M[j] = empty
M[0] = 0 global array
M-Compute-Opt(j) {
    if (M[j] is empty)
        M[j] = max(v<sub>j</sub> + M-Compute-Opt(p(j)), M-Compute-Opt(j-1))
    return M[j]
}
```

#### Weighted Interval Scheduling: Running Time

Claim. Memoized version of algorithm takes O(n log n) time.

- Sort by finish time: O(n log n).
- Computing  $p(\cdot)$ :  $O(n \log n)$  via binary search.
- M-Compute-Opt(j): each invocation takes O(1) time and either
  - (i) returns an existing value M[j]
  - (ii) fills in one new entry M[j] and makes two recursive calls
- Progress measure  $\Phi$  = # nonempty entries of M[].
  - initially  $\Phi$  = 0, throughout  $\Phi \leq n$ .
  - (ii) increases  $\Phi$  by 1  $\Rightarrow$  at most 2n recursive calls.
- Overall running time of M-Compute-Opt(n) is O(n). •

Remark. O(n) if jobs are pre-sorted by start and finish times.

Weighted Interval Scheduling: Finding a Solution

Q. Dynamic programming algorithms computes optimal value. What if we want the solution itself?

A. Do some post-processing.

```
Run M-Compute-Opt(n)
Run Find-Solution(n)

Find-Solution(j) {
    if (j = 0)
        output nothing
    else if (v<sub>j</sub> + M[p(j)] > M[j-1])
        print j
        Find-Solution(p(j))
    else
        Find-Solution(j-1)
}
```

• # of recursive calls  $\leq n \Rightarrow O(n)$ .

#### Weighted Interval Scheduling: Bottom-Up

Bottom-up dynamic programming. Unwind recursion.

```
Input: n, s<sub>1</sub>,...,s<sub>n</sub>, f<sub>1</sub>,...,f<sub>n</sub>, v<sub>1</sub>,...,v<sub>n</sub>
Sort jobs by finish times so that f_1 \leq f_2 \leq \ldots \leq f_n.
Compute p(1), p(2), ..., p(n)
Iterative-Compute-Opt {
    M[0] = 0
    for j = 1 to n
        M[j] = max(v<sub>j</sub> + M[p(j)], M[j-1])
}
```

#### Practice Midterm

Recall the weighted interval scheduling problem in which we are given a list of n meeting requests  $J1 = [s1, f1], \ldots, Jn = [sn, fn]$  with positive weights w1, ..., wn > 0 where meeting request Ji starts at time si and finishes at time fi > si. We are given a single conference room and our goal is to find the maximum weight schedule with no conflicts (recall that requests Ji and Jk conflict if they overlap).

Part A: Does the greedy strategy (sort by weight) work?



#### Practice Midterm

Recall the weighted interval scheduling problem in which we are given a list of n meeting requests  $J_1 = [s_1, f_1], \ldots, J_n = [s_n, f_n]$  with positive weights  $w_1, \ldots, w_n > 0$  where meeting request  $J_i$  starts at time  $s_i$  and finishes at time  $f_i > s_i$ . We are given a single conference room and our goal is to find the maximum weight schedule with no conflicts (recall that requests  $J_i$  and  $J_k$  conflict if they overlap).



#### Practice Midterm

T(1), T(2), T(3), T(4) < 11 and T(n) =  $7T(n/2)+T(n/5) + n^3$ 

Use induction to prove  $T(n) \le 10n^3$ 

Bases Cases? Trivially true for n< 5.

**Inductive Hypothesis:**  $T(k) \le 10k^3$  whenever k < n

Inductive Step:

T(n) =  $7T(n/2)+T(n/5) + n^3 \le 10^7(n^3/8) + 10^n^3/125 + n^3$  (IH) <=  $10n^3$  (by algebra)