

Announcements:

- Midterm: Tuesday, Oct 27, in class.
 - one handwritten cheat sheet.
 - through dynamic programming.
 - midterm reviews:
 - Taggart, Sunday,
 - Hartline, Monday, 6-8pm,

Reading: 6.4, 6.8**Last time:**

- Dynamic Programming
- Weighted Interval scheduling

Today:

- D.P. (cont.)
- Integer Knapsack
- Interval Pricing.

Suggested Approach

- I. identify subproblem in english
 $\text{OPT}(i)$ = “optimal schedule of $\{i, \dots, n\}$ (sorted by start time)”
- II. specify subproblem recurrence
$$\text{OPT}(i) = \max(\text{OPT}(i + 1), v_i + \text{OPT}(\text{next}(i)))$$
- III. identify base case
$$\text{OPT}(n + 1) = 0$$
- IV. write iterative DP.
(see last thurs)

Interval Pricing**input:** • n customers $S = \{1, \dots, n\}$

- T days.
- i 's ok days: $I_i = \{s_i, \dots, f_i\}$
- i 's value: $v_i \in \{1, \dots, V\}$

output: • prices $p[t]$ for day t .

- consumer i buys on day $t_i = \text{argmin}_{t \in I_i} p[t]$ if $p[t_i] \leq v_i$.
- revenue = $\sum_{i \text{ that buys}} p[t_i]$.
- goal: maximize revenue.

Dynamic Programming: Finding Subproblems

“find a first decision you can make which breaks problem into pieces that

- (a) do not interact (across subproblems)
- (b) can be describe succinctly.”

Example: Integer Knapsack

input: • n objects $S = \{1, \dots, n\}$

- s_i = size of object i (integer).
- v_i = value of object i .
- capacity C of knapsack (integer)

output:

- subset $K \subseteq S$ of objects that
 - (a) fit in knapsack together
(i.e., $\sum_{i \in K} s_i \leq C$)
 - (b) maximize total value
(i.e., $\sum_{i \in K} v_i$)

Greedy fails, e.g.,

- largest value/size:

$$\mathbf{v} = (C/2 + 2, C/2, C/2).$$

$$\mathbf{s} = (C/2 + 1, C/2, C/2).$$

- smallest value/size:

$$\mathbf{v} = (1, C/2, C/2).$$

$$\mathbf{s} = (2, C/2, C/2).$$

Question: What is “first decision we can make” to separate into subproblems?

Answer: Is item 1 in the knapsack or not?

- if 1 in knapsack:

value of knapsack is v_i + optimal knapsack value on $S \setminus \{1\}$ with capacity $C - s_1$.

- if 1 not in knapsack:

value of knapsack is optimal knapsack on $S \setminus \{1\}$ with capacity C .

Succinct description:

- remaining objects $\{j, \dots, n\}$ represented by “ j ”
- remaining capacity represented by $D \in \{0, \dots, C\}$.

Step I: identify subproblem in Correctness English

induction

$\text{OPT}(j, D)$

= “value of optimal size D knapsack on $\{j, \dots, n\}$ ” **Runtime**

$$T(n, C) = O(\# \text{ of subprobs} \times \text{cost per subprob}) \\ = O(nC).$$

Step II: write recurrence

Note: not polynomial time.

$\text{OPT}(j, D)$

$$= \max(\underbrace{v_j + \text{OPT}(j+1, D - s_j)}_{\text{if } s_j \leq D}, \text{OPT}(j+1, D))$$

Step III: base case

$$\text{OPT}(n+1, D) = 0 \text{ (for all } D)$$

Step IV: iterative DP

Algorithm: knapsack

1. $\forall D$, $\text{memo}[n+1, D] = 0$.

2. for $i = n$ down to 1,

for $D = C$ down to 0,

(a) if i fits (i.e., $s_i \leq D$)

$$\text{memo}[j, D] = \max[\text{memo}[j+1, D], \\ v_j + \text{OPT}(j+1, D - s_j)]$$

(b) else,

$$\text{memo}[j, D] = \text{memo}[j+1, D]$$

3. return $\text{memo}[1, C]$

Example: Interval Pricing

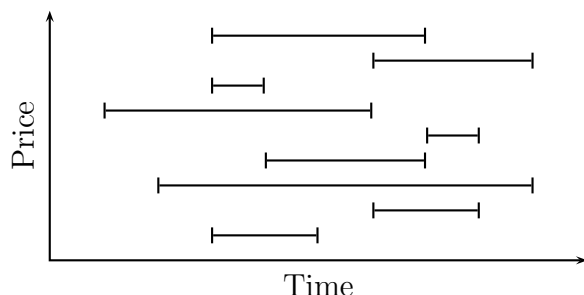
input: • n customers $S = \{1, \dots, n\}$

- T days.
- i 's ok days: $I_i = \{s_i, \dots, f_i\}$
- i 's value: $v_i \in \{1, \dots, V\}$

output: • prices $p[t]$ for day t .

- consumer i buys on day $t_i = \arg\min_{t \in I_i} p[t]$ if $p[t_i] \leq v_i$.
- revenue = $\sum_{i \text{ that buys}} p[t_i]$.
- goal: maximize revenue.

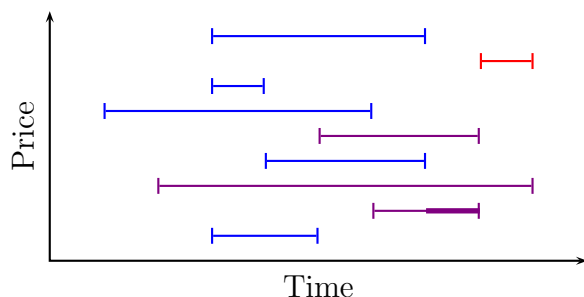
Example:



Question: What is “first decision we can make” to separate into subproblems?

Answer: day and price of smallest price.

Example:



Step I: identify subproblem in English

$\text{OPT}(s, f, p)$

= “optimal revenue from intervals strictly between s and f with minimum price at least p ”

Step II: write recurrence

$\text{OPT}(s, f, p)$

$$= \max_{s < t < f, q \geq p} \text{Rev}(t, p) + \text{OPT}(s, t, q) + \text{OPT}(t, f, q).$$

Step III: base case

- $\text{OPT}(s, s + 1, p) = 0$.
- $\text{OPT}(s, t, P + 1) = 0$.

Step IV: iterative DP

(exercise)

Correctness

induction

Runtime

- precompute $\text{Rev}(t, p)$ in $O(nV)$ time.
- size of table: $O(n^2V)$
- cost of combine: $O(nV)$.
- total: $O(n^3V^2)$.

Note: can be improved to $O(n^4)$ with slightly better program.