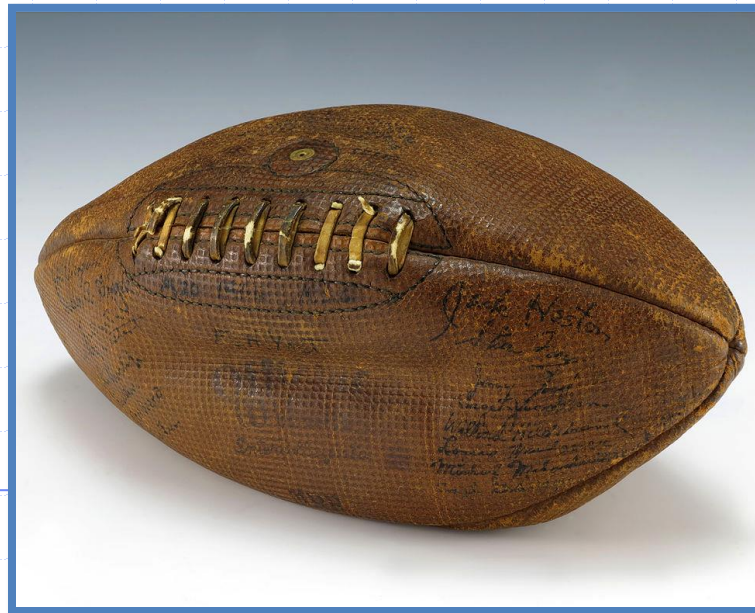


Presentation for use with the textbook, *Algorithm Design and Applications*, by M. T. Goodrich and R. Tamassia, Wiley, 2015

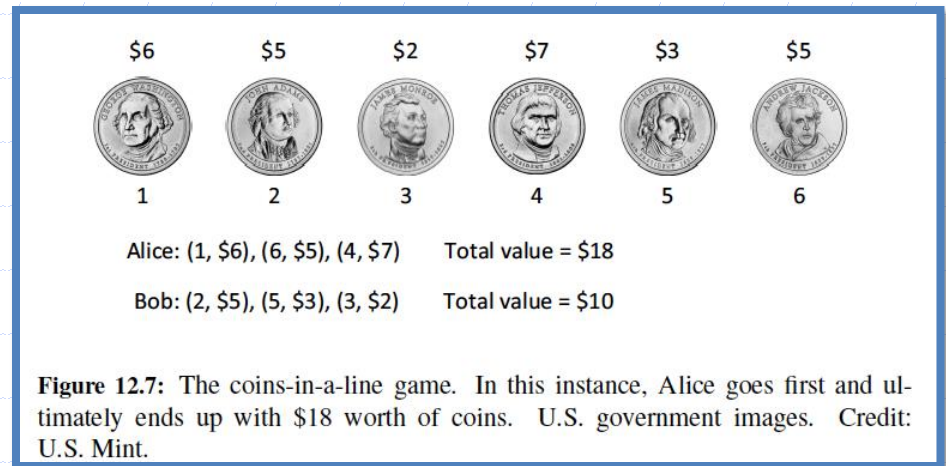
# Dynamic Programming: Game Strategies



Football signed by President Gerald Ford when playing for University of Michigan. Public domain image.

# Coins in a Line

- ◆ “Coins in a Line” is a game whose strategy is sometimes asked about during job interviews.
- ◆ In this game, an even number,  $n$ , of coins, of various denominations, are placed in a line.
- ◆ Two players, who we will call Alice and Bob, take turns removing one of the coins from either end of the remaining line of coins.
- ◆ The player who removes a set of coins with larger total value than the other player wins and gets to keep the money. The loser gets nothing.
- ◆ Alice’s goal: get the most.



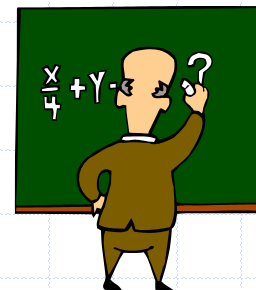
# False Start 1: Greedy Method

- ◆ A natural **greedy** strategy is “always choose the largest-valued available coin.”
- ◆ But this doesn’t always work:
  - [5, 10, 25, 10]: Alice chooses 10
  - [5, 10, 25]: Bob chooses 25
  - [5, 10]: Alice chooses 10
  - [5]: Bob chooses 5
- ◆ Alice’s total value: 20, Bob’s total value: 30.  
(Bob wins, Alice loses)

# False Start 2: Greedy Method

- ◆ Another **greedy** strategy is “choose odds or evens, whichever is better.”
- ◆ Alice can always win with this strategy, but won’t necessarily get the most money.
- ◆ Example: [1, 3, 6, 3, 1, 3]
- ◆ Alice’s total value: \$9, Bob’s total value: \$8.
- ◆ Alice wins \$9, but could have won \$10.
- ◆ How?

# The General Dynamic Programming Technique



- ◆ Applies to a problem that at first seems to require a lot of time (possibly exponential), provided we have:
  - **Simple subproblems:** the subproblems can be defined in terms of a few variables, such as  $j$ ,  $k$ ,  $l$ ,  $m$ , and so on.
  - **Subproblem optimality:** the global optimum value can be defined in terms of optimal subproblems
  - **Subproblem overlap:** the subproblems are not independent, but instead they overlap (hence, should be constructed bottom-up).

# Defining Simple Subproblems

- ◆ Since Alice and Bob can remove coins from either end of the line, an appropriate way to define subproblems is in terms of a range of indices for the coins, assuming they are initially numbered from 1 to  $n$ .
- ◆ Thus, let us define the following indexed parameter:

$$M_{i,j} = \begin{cases} \text{the maximum value of coins taken by Alice, for coins} \\ \text{numbered } i \text{ to } j, \text{ assuming Bob plays optimally.} \end{cases}$$

Therefore, the optimal value for Alice is determined by  $M_{1,n}$ .

# Subproblem Optimality

- ◆ Let us assume that the values of the coins are stored in an array,  $V$ , so that coin 1 is of Value  $V[1]$ , coin 2 is of Value  $V[2]$ , and so on.
- ◆ Note that, given the line of coins from coin  $i$  to coin  $j$ , the choice for Alice at this point is either to take coin  $i$  or coin  $j$  and thereby gain a coin of value  $V[i]$  or  $V[j]$ .
- ◆ Once that choice is made, play turns to Bob, who we are assuming is playing optimally.
  - We should assume that Bob will make the choice among his possibilities that minimizes the total amount that Alice can get from the coins that remain.

# Subproblem Overlap

◆ Alice should choose based on the following:

- If  $j = i + 1$ , then she should pick the larger of  $V[i]$  and  $V[j]$ , and the game is over.

- Otherwise, if Alice chooses coin  $i$ , then she gets a total value of

$$\min\{M_{i+1,j-1}, M_{i+2,j}\} + V[i].$$

- Otherwise, if Alice chooses coin  $j$ , then she gets a total value of

$$\min\{M_{i,j-2}, M_{i+1,j-1}\} + V[j].$$

◆ That is, we have initial conditions, for  $i=1,2,\dots,n-1$ :

$$M_{i,i+1} = \max\{V[i], V[i+1]\}.$$

◆ And general equation:

$$M_{i,j} = \max\{\min\{M_{i+1,j-1}, M_{i+2,j}\} + V[i], \min\{M_{i,j-2}, M_{i+1,j-1}\} + V[j]\}.$$



# Analysis of the Algorithm

- ◆ We can compute the  $\mathbf{M}_{i,j}$  values, then, using memoization, by starting with the definitions for the above initial conditions and then computing all the  $\mathbf{M}_{i,j}$ 's where  $j - i + 1$  is 4, then for all such values where  $j - i + 1$  is 6, and so on.
- ◆ Since there are  $\mathbf{O}(n)$  iterations in this algorithm and each iteration runs in  $\mathbf{O}(n)$  time, the total time for this algorithm is  $\mathbf{O}(n^2)$ .
- ◆ To recover the actual game strategy for Alice (and Bob), we simply need to note for each  $\mathbf{M}_{i,j}$  whether Alice should choose coin  $i$  or coin  $j$ .

# Algorithm for Coins-in-a-Line from Lecture

**Algo:** Coins (C)

**Input:** list C of integer  $n \geq 0$  coins

**Output:** maximum value that Alice, the first player, can obtain from C assuming both players play perfectly

$M \leftarrow$  new  $n \times n$  Matrix

for  $i \leftarrow$  to  $n$

$M[i, i] \leftarrow C(i)$  // only one coin, pick it (base case)

for  $i \leftarrow 1$  to  $(n-1)$  do // two coins to choose from (base case)

$M[i, i+1] \leftarrow \max \{ C(i), C(i+1) \}$

for Length  $\leftarrow 2$  to  $(n-1)$  do

for  $i \leftarrow 1$  to  $(n - \text{Length})$

$j \leftarrow i + \text{Length}$

$M[i, j] \leftarrow \max \{$

$C(i) + \{ \min \{ M[i+2, j], m[i+1, j-1] \} ,$

$C(j) + \{ \min \{ M[i+1, j-1], M[i, j-2] \} \}$

return  $M[1, n]$