

# TOPIC 6 DYNAMIC PROGRAMMING



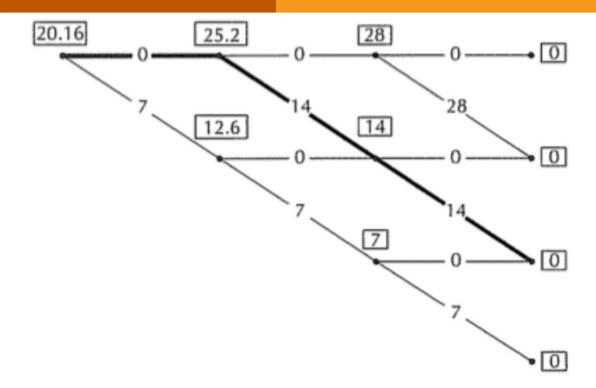
## **Dynamic Programming**

- ALL dynamic programming problems need a few common elements
- State variables
  - What information do you need to describe where you are
- Choice/Decision variables
  - What can you choose to do
- Dynamics
  - How do choice variables combine with state variables to evolve through time
- Value Function
  - Discounted value of all future payoffs
- Bellman Equation
  - Value today is immediate payoff plus discounted payoff tomorrow
- Terminal/Boundary Condition
  - Value function after the last time step



## Fishing Example

What are the state variables, choice variables, dynamics, value function, Bellman equation and terminal condition?





## Fishing Example

How would we put this in python to find the optimal policy?



## Fishing Example

Let's rearrange the triangle upside down into a box!



## **Dynamic Programming**

- Value Function
  - $v(S_t, t) = \max_{x} \sum_{i=t}^{T} \delta^{i-t} r_i$
  - $v(S_t, t) = \max_{x} r_t + \delta \sum_{i=t+1}^{T} \delta^{i-t-1} r_i$
  - $v(S_t, t) = \max_{x} r_t + \delta v(S_{t+1}, t+1)$
- If I know the value function for all possible values of s tomorrow, then I can calculate it for all possible values of s today!
- In general, tomorrow's state is dependent on today's state and our choice today



# Mining Example

- You must decide how much ore to extract from a mine that will be shut down and abandoned after T years of operation.
- The sales price of extracted ore is p dollars per ton, and the total cost of extracting x tons of ore in any year, given that the mine contains s tons at the beginning of the year, is x²/(1+s) dollars.
- The mine currently contains M tons of ore
- This discount factor is  $\delta$
- Assuming the amount of ore extracted in any year must be an integer number of tons, what extraction schedule maximizes profits?



## Mining Example

 Can we pose this as a traditional optimization problem (not a DP)?



## Mining Example - DP

What are the state variables, choice variables, dynamics, value function, Bellman equation and terminal condition?





## **Dynamic Programming**

- The general Bellman Eq is
  - $v(S_t, t) = \max_{x} r_t + \delta v(S_{t+1}, t+1)$
  - $S_t$  is a dynamic variable that changes through time
- For the mining example this is

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$$v(s,t) = \max_{0 \le x \le s} px - \frac{x^2}{1+s} + \delta v(s-x,t+1)$$

- s is one particular value that variable could take on
- If  $S_t$  takes on the value s, then  $S_{t+1}$  takes on the value s-x



# Mining Example

How would we code it in python?