



# Business Statistics: A Decision-Making Approach

7<sup>th</sup> Edition

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## **Chapter 19**

### Introduction to Decision Analysis



# Chapter Goals

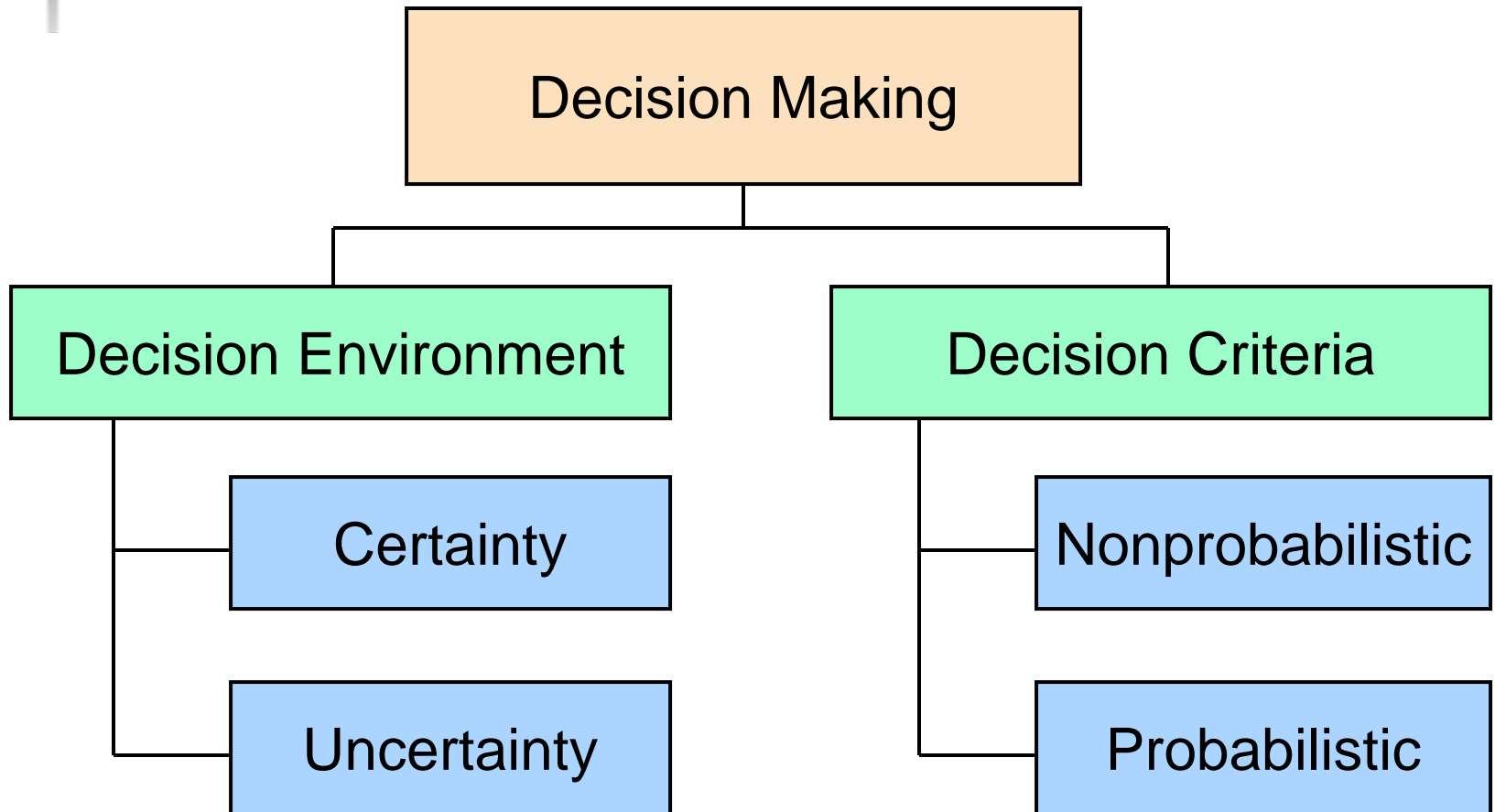
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**After completing this chapter, you should be able to:**

- Describe the decision environments of certainty and uncertainty
- Construct a payoff table and an opportunity-loss table
- Define and apply the expected value criterion for decision making
- Compute the value of perfect information
- Develop and use decision trees for decision making



# Decision Making Overview





# The Decision Environment

Decision Environment

Certainty \*

Uncertainty

**Certainty:** The results of decision alternatives are known

**Example:**

Must print 10,000 color brochures

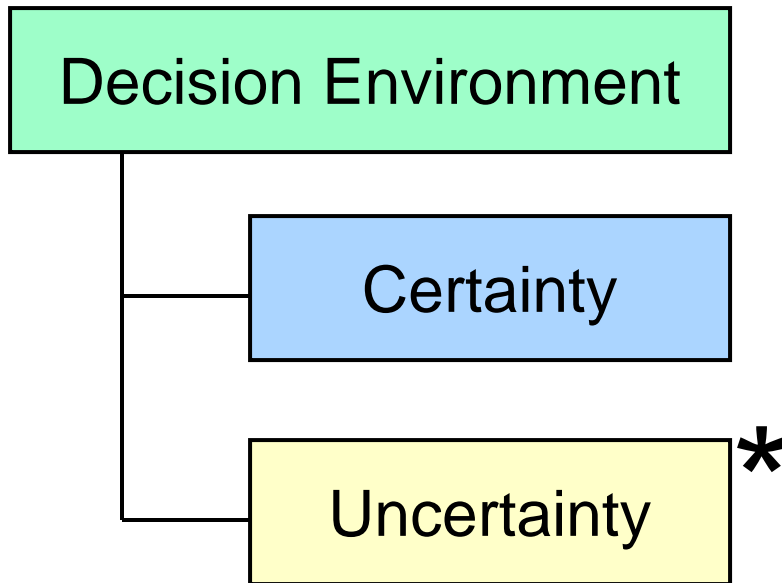
**Offset press A:** \$2,000 fixed cost  
+ \$.24 per page

**Offset press B:** \$3,000 fixed cost  
+ \$.12 per page



# The Decision Environment

*(continued)*



**Uncertainty:** The outcome that will occur after a choice is unknown

**Example:**

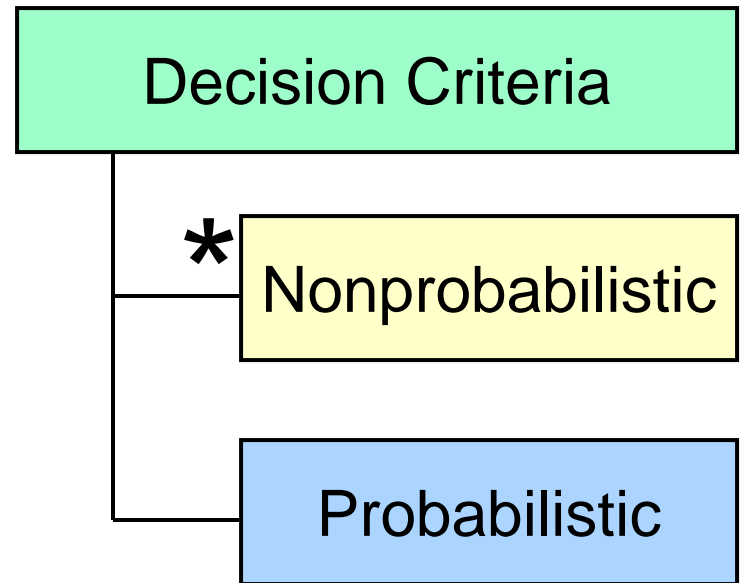
You must decide to buy an item now or wait. If you buy now the price is \$2,000. If you wait the price may drop to \$1,500 or rise to \$2,200. There also may be a new model available later with better features.



# Decision Criteria

**Nonprobabilistic Decision Criteria:**  
Decision rules that can be applied if the probabilities of uncertain events are not known.

- maximax criterion
- maximin criterion
- minimax regret criterion



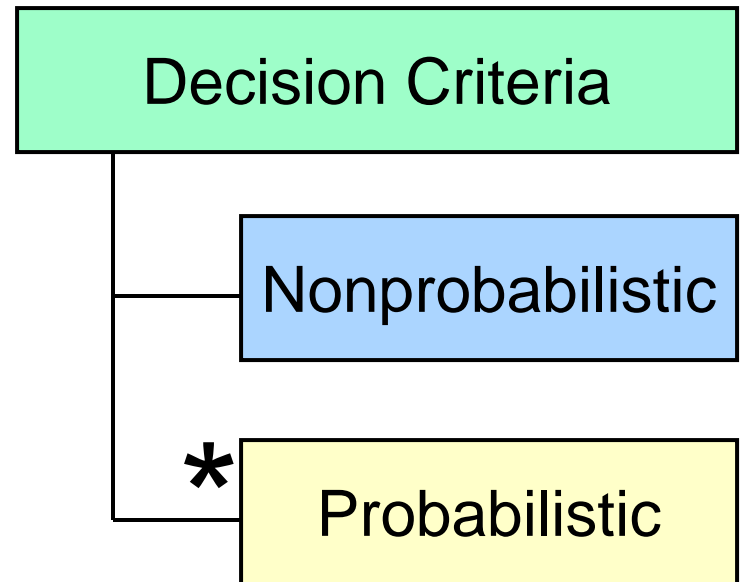


# Decision Criteria

*(continued)*

**Probabilistic Decision Criteria:**  
Consider the probabilities of uncertain events and select an alternative to maximize the expected payoff or minimize the expected loss

- maximize expected value
- minimize expected opportunity loss





# A Payoff Table

A payoff table shows **alternatives**, **states of nature**, and payoffs

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)		
	Strong Economy	Stable Economy	Weak Economy
Large factory	200	50	-120
Average factory	90	120	-30
Small factory	40	30	20



# Maximax Solution

The maximax criterion (an optimistic approach):

1. For each option, find the maximum payoff

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)			1. Maximum Profit
	Strong Economy	Stable Economy	Weak Economy	
Large factory	200	50	-120	200
Average factory	90	120	-30	120
Small factory	40	30	20	40



# Maximax Solution

(continued)

The maximax criterion (an optimistic approach):

1. For each option, find the maximum payoff
2. Choose the option with the greatest maximum payoff

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)		
	Strong Economy	Stable Economy	Weak Economy
Large factory	200	50	-120
Average factory	90	120	-30
Small factory	40	30	20

1. Maximum Profit

2. Greatest maximum is to choose **Large factory**



# Maximin Solution

The maximin criterion (a pessimistic approach):

1. For each option, find the minimum payoff

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)			1. Minimum Profit
	Strong Economy	Stable Economy	Weak Economy	
Large factory	200	50	-120	-120
Average factory	90	120	-30	-30
Small factory	40	30	20	20



# Maximin Solution

(continued)

The maximin criterion (a pessimistic approach):

1. For each option, find the minimum payoff
2. Choose the option with the **greatest minimum payoff**

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)			1. Minimum Profit	2. Greatest minimum is to choose <b>Small factory</b>
	Strong Economy	Stable Economy	Weak Economy		
Large factory	200	50	-120	-120	
Average factory	90	120	-30	-30	
Small factory	40	30	20	20	



# Opportunity Loss

Opportunity loss is the difference between an **actual** payoff for a decision and the **optimal** payoff for that state of nature

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)		
	Strong Economy	Stable Economy	Weak Economy
Large factory	200	50	-120
Average factory	90	120	-30
Small factory	40	30	20

Payoff Table

The choice “Average factory” has payoff 90 for “Strong Economy”. Given “Strong Economy”, the choice of “Large factory” would have given a payoff of 200, or 110 higher. Opportunity loss = 110 for this cell.



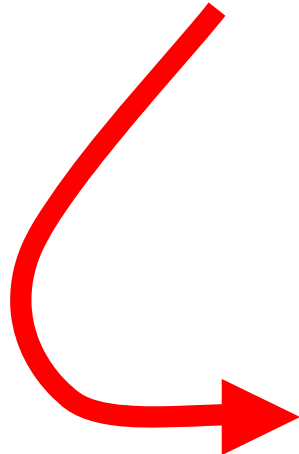
# Opportunity Loss

(continued)

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)		
	Strong Economy	Stable Economy	Weak Economy
Large factory	200	50	-120
Average factory	90	120	-30
Small factory	40	30	20

Payoff Table

Opportunity Loss Table



Investment Choice (Alternatives)	Opportunity Loss in \$1,000's (States of Nature)		
	Strong Economy	Stable Economy	Weak Economy
Large factory	0	70	140
Average factory	110	0	50
Small factory	160	90	0



# Minimax Regret Solution

The minimax regret criterion:

1. For each alternative, find the maximum opportunity loss (or “regret”)

## Opportunity Loss Table

Investment Choice (Alternatives)	Opportunity Loss in \$1,000's (States of Nature)			1. Maximum Op. Loss
	Strong Economy	Stable Economy	Weak Economy	
Large factory	0	70	140	140
Average factory	110	0	50	110
Small factory	160	90	0	160



# Minimax Regret Solution

(continued)

The minimax regret criterion:

1. For each alternative, find the maximum opportunity loss (or “regret”)
2. Choose the option with the **smallest maximum loss**

Opportunity Loss Table

Investment Choice (Alternatives)	Opportunity Loss in \$1,000's (States of Nature)			1. Maximum Op. Loss	2. Smallest maximum loss is to choose <b>Average factory</b>
	Strong Economy	Stable Economy	Weak Economy		
Large factory	0	70	140	140	
Average factory	110	0	50	110	
Small factory	160	90	0	160	



# Expected Value Solution

- The expected value is the weighted average payoff, given specified probabilities for each state of nature

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)		
	Strong Economy	Stable Economy	Weak Economy
	(.3)	(.5)	(.2)
Large factory	200	50	-120
Average factory	90	120	-30
Small factory	40	30	20

Suppose these probabilities have been assessed for these states of nature



# Expected Value Solution

(continued)

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)			Expected Values	Maximize expected value by choosing <b>Average factory</b>
	Strong Economy (.3)	Stable Economy (.5)	Weak Economy (.2)		
Large factory	200	50	-120	61	
Average factory	90	120	-30	81	
Small factory	40	30	20	31	

**Example:**  $EV(\text{Average factory}) = 90(.3) + 120(.5) + (-30)(.2)$   
 $= 81$

# Expected Opportunity Loss Solution



## Opportunity Loss Table

Investment Choice (Alternatives)	Opportunity Loss in \$1,000's (States of Nature)			Expected Op. Loss (EOL)	Minimize expected op. loss by choosing <b>Average factory</b>
	Strong Economy (.3)	Stable Economy (.5)	Weak Economy (.2)		
Large factory	0	70	140	63	
Average factory	110	0	50	43	
Small factory	160	90	0	93	

**Example:**  $EOL \text{ (Large factory)} = 0(.3) + 70(.5) + (140)(.2)$   
 $= 63$



# Cost of Uncertainty

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- Cost of Uncertainty (also called Expected Value of Perfect Information, or EVPI)
- Cost of Uncertainty
  - = Expected Value Under Certainty (EVUC)
    - Expected Value without information (EV)

so:

$$\begin{aligned} \text{Expected Cost of Uncertainty} \\ &= \text{EVPI} \\ &= \text{EVUC} - \text{EV} \end{aligned}$$

# Expected Value Under Certainty

- Expected Value Under Certainty (EVUC):

EVUC =  
 expected  
 value of the  
 best decision,  
 given perfect  
 information

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)		
	Strong Economy (.3)	Stable Economy (.5)	Weak Economy (.2)
Large factory	200	50	-120
Average factory	90	120	-30
Small factory	40	30	20

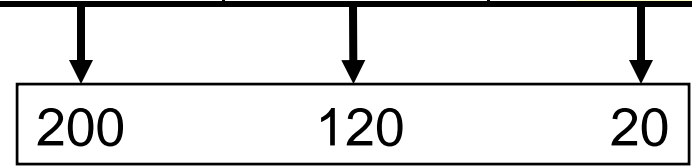
200	120	20
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**Example:** Best decision given "Strong Economy" is "Large factory"

# Expected Value Under Certainty

(continued)

Investment Choice (Alternatives)	Profit in \$1,000's (States of Nature)		
	Strong Economy (.3)	Stable Economy (.5)	Weak Economy (.2)
Large factory	200	50	-120
Average factory	90	120	-30
Small factory	40	30	20



- Now weight these outcomes with their probabilities to find EVUC:

$$\text{EVUC} = 200(.3) + 120(.5) + 20(.2) = 124$$



# Cost of Uncertainty Solution

- **Cost of Uncertainty (EVPI)**

= Expected Value Under Certainty (EVUC)

– Expected Value without information (EV)

Recall:  $EVUC = 124$

EV is maximized by choosing “Average factory”,  
where  $EV = 81$

$$\begin{aligned} \text{so: } \mathbf{EVPI} &= \mathbf{EVUC - EV} \\ &= \mathbf{124 - 81} \\ &= \mathbf{43} \end{aligned}$$



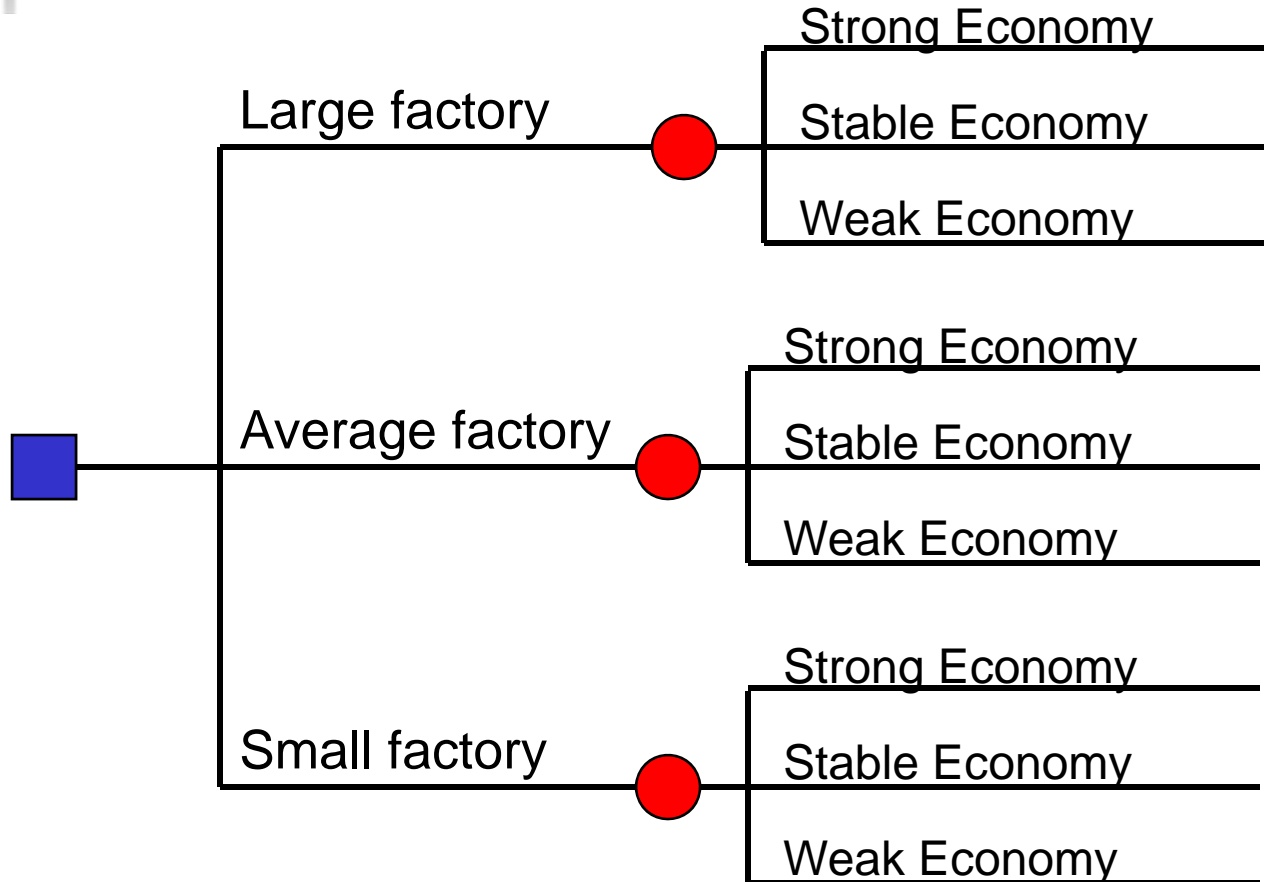
# Decision Tree Analysis

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- A Decision tree shows a decision problem, beginning with the initial decision and ending with all possible outcomes and payoffs.
- Use a square to denote decision nodes
- Use a circle to denote uncertain events



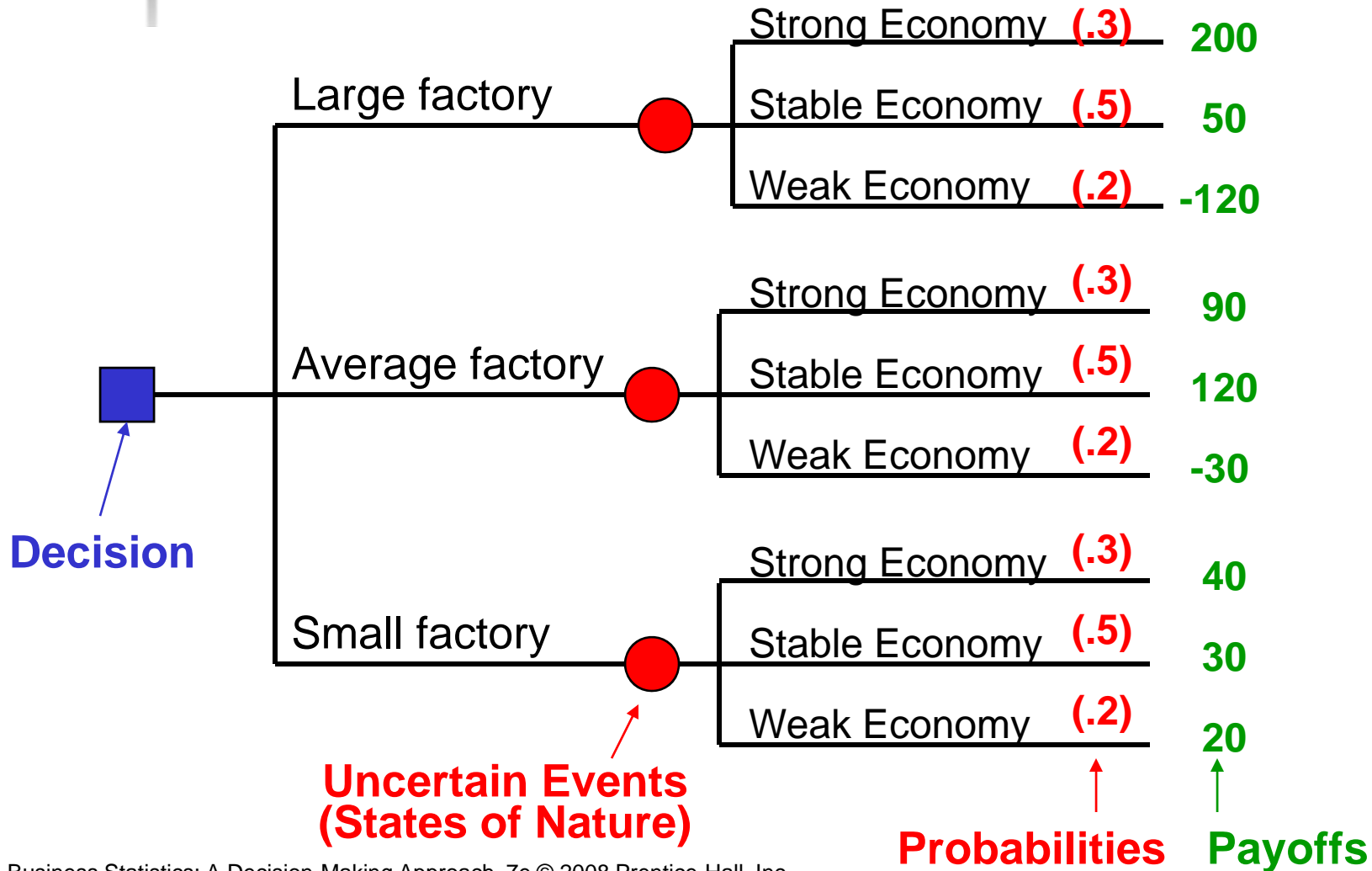
# Sample Decision Tree





# Add Probabilities and Payoffs

(continued)



# Fold Back the Tree

$$EV = 200(.3) + 50(.5) + (-120)(.2) = 61$$

Large factory

Strong Economy	(.3)	200
Stable Economy	(.5)	50
Weak Economy	(.2)	-120

$$EV = 90(.3) + 120(.5) + (-30)(.2) = 81$$

Average factory

Strong Economy	(.3)	90
Stable Economy	(.5)	120
Weak Economy	(.2)	-30

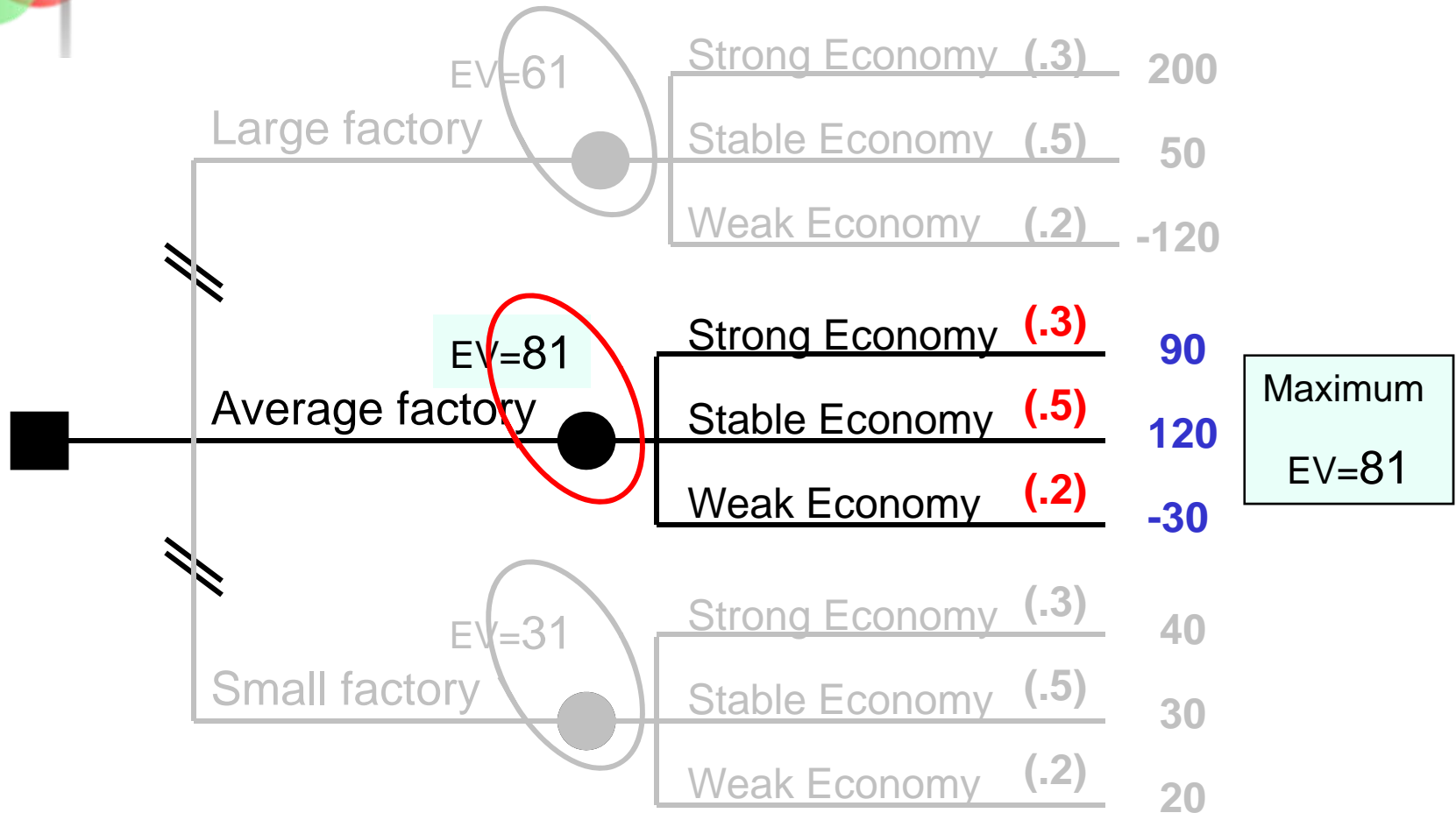
$$EV = 40(.3) + 30(.5) + 20(.2) = 31$$

Small factory

Strong Economy	(.3)	40
Stable Economy	(.5)	30
Weak Economy	(.2)	20



# Make the Decision





# Chapter Summary

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- Examined decision making environments
  - certainty and uncertainty
- Reviewed decision making criteria
  - nonprobabilistic: maximax, maximin, minimax regret
  - probabilistic: expected value, expected opp. loss
- Computed the Cost of Uncertainty (EVPI)
- Developed decision trees and applied them to decision problems