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# Statistics and Data Analysis

### The Dice Game

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#### Three investments

▶ Let Green, Red, and White be three hypothetical **investments** with the following probability distributions for their yearly **gross returns**.

Probability	1/6	1/6	1/6	1/6	1/6	1/6
Green	0.8	0.9	1.1	1.1	1.2	1.4
Red	0.06	0.2	1	3	3	3
White	0.95	1	1	1	1	1.1

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### **Returns and risks**

► For each investment, we may find its **mean** (expected value) and **standard deviation**.

Probability	1/6	1/6	1/6	1/6	1/6	1/6	Mean	SD
Green	0.8	0.9	1.1	1.1	1.2	1.4	1.083	0.195
Red	0.06	0.2	1	3	3	3	1.710	1.323
White	0.95	1	1	1	1	1.1	1.008	0.045

The mean measures the expected **return**. The standard deviation measures the **risk**.

• Which one do you prefer?

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#### **Investments and outcomes**

- ▶ You have \$1000 invested in each of Green, Red, and White.
- ► The **market uncertainty** is determined by the outcome of rolling three dices.
  - ▶ The outcome determines the annual returns of the investments.

▶ Suppose the outcome is 2 for Green, 5 for Red, and 3 for White.

Then the after-one-year values are \$900, \$3000, and \$1000, respectively.

▶ Suppose the outcome is 4 for Green, 2 for Red, and 6 for White. Then the after-two-year values are \$990, \$600, and \$1100, respectively.

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### On the worksheet

▶ On the worksheet, investment amounts and dice values can be recorded.

	Year	Green	Red	White
1	Start	$1000\ (\ 2\ )$	$1000\ (\ 5\ )$	$1000\ (\ 3\ )$
1	End	900	3000	1000
2	Start	900 (4)	$3000\ (\ 2\ )$	1000 ( 6 )
2	End	990	600	1100
2	Start			
5	End			

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### Adjusting investments

- ▶ In practice, one may **adjust the investments** before a year starts.
- ▶ Suppose that we have adjusted the amounts at the end of year 1: \$1600 for Green, \$1600 for Red, and \$1700 for White.

	Year	Green	Red	White
1	Start	$1000\ (\ 2\ )$	$1000\ (\ 5\ )$	$1000\ (\ 3\ )$
T	End	900	3000	1000
2	Start	1600 (4)	1600(2)	1700(6)
2	End	1760	320	1870
2	Start			
5	End			

• Objective: To **maximize the total value** at the end of year 8.

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- ▶ Form teams of 6 students.
- ▶ Start with \$1000 in each investment. Carry out the game for 8 years.
- ▶ The instructor will role the dices for all teams.
- ▶ Team members discuss together for amount redistribution.

#### Roles for team members:

- Market: Write down the outcome of dice rolling and find the right gross return rates.
- Accountant: Calculate the values at the end of a year.
- Green investor: Double check the Green account.
- ▶ Red investor: Double check the Red account.
- White investor: Double check the White account.
- CEO: Lead the team.

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### Let's start!

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# Year 8 (the final year)

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## End!

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#### Discussions

▶ What is the best strategy in this game?



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### Discussions

▶ "Do not put all your eggs in one basket."



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#### The "Pink" investment

• Consider the "Pink" investment (which is a **portfolio**):

$$\operatorname{Pink} = \frac{\operatorname{Red} + \operatorname{White}}{2}.$$

▶ The mean and standard deviation of Pink can be calculated:

Note that  $\mu_{\text{pink}} = \frac{1}{2}\mu_{\text{red}} + \frac{1}{2}\mu_{\text{white}}$  but  $\sigma_{\text{pink}} < \frac{1}{2}\sigma_{\text{red}} + \frac{1}{2}\sigma_{\text{white}}!$ 

As we will introduce later in this semester,  $\sigma_{\text{pink}} = \sqrt{\frac{1}{4}\sigma_{\text{red}}^2 + \frac{1}{4}\sigma_{\text{white}}^2}$ .

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Green	1.083	0.195
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Pink	1.359	0.662

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### Volatility-adjusted returns

To compare two investments, we may compare their volatility-adjusted returns:

Volatility-adjusted return =  $\mu - \frac{\sigma^2}{2}$ .

Investment	Mean	SD	Variance	Volatility-adjusted return
Green	1.083	0.195	0.038	1.064
Red	1.710	1.323	1.750	0.835
White	1.008	0.045	0.002	1.007
Pink	1.359	0.662	0.438	1.140

▶ Finding the best way to combine some given investments is the **portfolio optimization** problem.

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### Lessons and warnings

- ► Lessons:
  - Expected values (means) and standard deviations (or variances) are used to measure returns and risks.
  - Diversification is a good idea to maximize long-term returns.
  - ▶ To look for the best diversification, probability helps.
- ► Warnings:
  - Knowing the probability **distributions** is hard.
  - Performances of multiple investments may actually be **dependent**.
- Responses:
  - Estimating the distributions is easier than predicting the outcome.
  - There are methods to address dependency (through covariances).

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