

# MA213 Basic Statistics and Probability - Lab4 guide

## Lab 4: Simulation and Probability R guide

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### Learning Objectives

- Validate and Explain Probability Distributions: Assess the validity of a probability distribution using the concepts of outcome, sample space, and probability properties (e.g., disjoint outcomes, probabilities between 0 and 1, and total probabilities summing to 1).
- Compute Probabilities Using Various Tools: Use logic, Venn diagrams, and probability rules to compute probabilities for events.
- Understand and Compute Expectations and Variances: Explain the concepts of expectations and variances of random variables, and compute the expectation and variance of a linear combination of random variables.
- Conduct Hypothesis Testing Using Simulation: Set up null and alternative hypotheses to test for independence between variables, and use simulation techniques to evaluate data support for these hypotheses.

### How do you roll a die using R?

`sample()` will randomly sample `size` many sample from the vector `x`

`sample(x, size, replace = FALSE, prob = NULL)`

```
# example
x <- c("apple", "pear", "strawberry", "orange", "lemon")

sample(x, 3) # picks 3 unique fruits from the vector (without replacement)

## [1] "strawberry" "pear"          "orange"

sample(x, 10, replace=TRUE) # picks 10 fruits, allowing repeats (sampling with replacement)

## [1] "orange"      "strawberry" "pear"        "lemon"      "apple"
## [6] "strawberry" "pear"       "strawberry" "apple"      "orange"
```

Exercise : Let's make a die (a vector of size 6) and roll once.

```
#
#
#
```

### Loops

Loops repeatedly execute a block of code for various elements.

```
# Example: Print numbers from 1 to 5
print("Example1 ")
```

```
## [1] "Example1 "
```

```
for (i in 1:5) {  
  print(i)  
}
```

```
## [1] 1  
## [1] 2  
## [1] 3  
## [1] 4  
## [1] 5
```

```
# Example 2: Print numbers from 1 to 5  
print("Example2 ")
```

```
## [1] "Example2 "
```

```
for (i in c(1,2,3,4,5)) {  
  print(i)  
}
```

```
## [1] 1  
## [1] 2  
## [1] 3  
## [1] 4  
## [1] 5
```

```
# Example3: Simulate rolling a die 5 times and record it  
print("Example3 ")
```

```
## [1] "Example3 "
```

```
rolls <- rep(0, 5) # Initialize a vector of length 5 with zeros to store roll results  
for (i in 1:5) {  
  rolls[i] <- sample(1:6, 1) # Sample one number between 1 and 6 and assign it to the i-th position  
}  
rolls
```

```
## [1] 4 6 3 3 4
```

**Exercise :** Let's make a coin (a vector of size 2) and flip it 10 times and record them.

```
#  
#  
#
```

## Function

Functions allow you to encapsulate reusable blocks of code and parameters.

```
# Example: Function to calculate (a+b)^2  
square <- function(a, b) {  
  value = (a + b)^2 # Calculate the square of the sum of a and b  
  return(value) # Return the calculated value  
}  
square(1,2) # Output: 9
```

```
## [1] 9
```

```
square(2,3) # Output: 25
```

```
## [1] 25
```

**Exercise :** Make a function to calculate the multiplication of the three numbers

```
# what should be inputs?  
# what is the output?
```

## Function + Loop

Combine loops and functions for repeated tasks.

```
# Example: Roll a die 5 times using a loop within a function
```

```
roll_multiple <- function(runs) {  
  rolls <- rep(0, runs) # create rolls vector of 0  
  
  for (i in 1:runs) {  
    rolls[i] <- sample(1:6, 1)  
  }  
  
  return(rolls)  
}  
roll_multiple(5)
```

```
## [1] 6 2 3 5 5
```

**Let's roll one dice and show the output.**

```
#Outcome from those two dice
```

```
dice1 <- sample(1:6, 1)  
dice2 <- sample(1:6, 1)  
  
sum_of_two <- dice1 + dice2  
sum_of_two
```

```
## [1] 6
```

**Using for loop, assign outcome of two dice rolled into myoutcome from 100 iterations.**

```
myoutcome = rep(0, 100) # make a vector of size 100 that has all zero's
```

```
for (i in 1:100){  
  dice1 <- sample(1:6, 1)  
  dice2 <- sample(1:6, 1)  
  sum_of_two <- dice1 + dice2  
  myoutcome[i] <- sum_of_two  
}  
  
head(myoutcome) # print first 6 entries
```

```
## [1] 8 7 3 6 9 3
```

Use `replicate()`, it carries out repeated tasks in a more computationally efficient way.

```
twodice_outcome <- function(){
  dice1 <- sample(1:6, 1)
  dice2 <- sample(1:6, 1)

  sum_of_two <- dice1 + dice2
  myoutcome <- sum_of_two

  return(myoutcome)
}
twodice_outcome() # this function works as one simulation run
```

```
## [1] 9
myoutcome <- replicate(n=30, twodice_outcome()) # 10 runs
myoutcome

## [1] 9 4 5 7 6 8 9 5 5 6 6 7 4 8 9 5 9 9 4 7 2 9 11 7 10
## [26] 5 9 7 9 2
```

Calculate probability of each outcome.

```
# for loop version (classic)
n = 30 # assign 30 for rolling times
myoutcome <- rep(0, n) #initialize empty vector or size n
for (i in 1:n){
  myoutcome[i] <- twodice_outcome() # store each outcome to ith entry in myoutcome vector
}
myoutcome # print out myoutcome
```

```
## [1] 7 7 6 6 8 7 9 7 7 9 5 7 4 5 9 10 7 3 3 9 6 9 6 6 12
## [26] 4 6 8 11 7
```

```
outcome_table <- table(myoutcome)
n <- length(myoutcome) # this length function will count how many unique output you have.
prob_outcome <- outcome_table/n # to calculate each probability, you divide each frequency by the total
prob_outcome
```

```
## myoutcome
##      3      4      5      6      7      8      9
## 0.06666667 0.06666667 0.06666667 0.20000000 0.26666667 0.06666667 0.16666667
##      10     11     12
## 0.03333333 0.03333333 0.03333333
```

```
# replicate version (faster but little challenging)
myoutcome <- replicate(n=30, twodice_outcome())
outcome_table <- table(myoutcome)
n <- length(myoutcome)
prob_outcome <- outcome_table/n
prob_outcome
```

```
## myoutcome
##      3      4      5      6      7      8      9
## 0.16666667 0.10000000 0.06666667 0.13333333 0.10000000 0.13333333 0.13333333
```

```
##           11           12
## 0.10000000 0.06666667
# how to ensure that it is proper probability?
sum(prob_outcome) # it needs to add up to 1

## [1] 1
```

Calculate the simulated expected value of the random variable.

```
outcome_table * prob_outcome

## myoutcome
##           3           4           5           6           7           8           9           11
## 0.8333333 0.3000000 0.1333333 0.5333333 0.3000000 0.5333333 0.5333333 0.3000000
##           12
## 0.1333333

names(outcome_table) # we need this

## [1] "3" "4" "5" "6" "7" "8" "9" "11" "12"
values <- as.numeric(names(outcome_table) )

# or
# values <- 2:12

sum(values * prob_outcome)

## [1] 6.9
mu_hat = sum(values * prob_outcome)

mu_hat

## [1] 6.9
```

Calculate the simulated variance of the random variable.

```
sigma_2_hat <- sum( (values-mu_hat)^2 * prob_outcome )
sigma_2_hat

## [1] 7.89
```

Make a function that has an input `n` and a list of output that gives you the simulated expected value and variance. (putting all together)

```
sim_fn <- function(n=1000){
  myoutcome = rep(0, n)

  for (i in 1:n){
    dice1 <- sample(1:6, 1)
    dice2 <- sample(1:6, 1)
    sum_of_two <- dice1 + dice2
    myoutcome[i] <- sum_of_two
  }
}
```

```

outcome_table <- table(myoutcome)

prob_outcome <- outcome_table/n

values <- as.numeric(names(outcome_table) ) # it takes out the each column name and make it as numeri

mu_hat = sum(values * prob_outcome)

sigma_2_hat <- sum( (values-mu_hat)^2 * prob_outcome )
output <- list(mu = mu_hat, sigma2 = sigma_2_hat) # list output
# output <- c(mu_hat, sigma_2_hat) # vector output
return(output)
}

sim_fn(100)

## $mu
## [1] 6.87
##
## $sigma2
## [1] 5.4731

sim_fn(1000)

## $mu
## [1] 6.926
##
## $sigma2
## [1] 5.996524

sim_fn(10000)

## $mu
## [1] 6.9577
##
## $sigma2
## [1] 5.770711

sim_fn(100000)

## $mu
## [1] 6.9978
##
## $sigma2
## [1] 5.801195

```