

```
library(dplyr)

##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##   filter, lag
## The following objects are masked from 'package:base':
##
##   intersect, setdiff, setequal, union

set.seed(1929)
```

HW3

HW3.1

The distribution of photons emitted by X ($X \sim \text{Poisson}(100)$) and Y is the number of photons which pass through an object.

If we know the amount of photons emitted by the x-ray beam we can describe the number of photons passing through the object by using the distribution $Y|X \sim \text{Binomial}(X, 0.4)$

Calculate the probability mass function for (X, Y) [eg $p(k, l) = P((X = k, Y = l))$]

```
set.seed(1929)
n_reps = 1

#Creating a data frame containing random draws from the Poisson distribution
photons_emitted.df <- data.frame(rpois(n_reps, 100))
names(photons_emitted.df) <- c('Photons')
#Number of photons emitted
photons <- sum(photons_emitted.df$Photons)
#Number of photons from one draw of the Poisson distribution which passes through the material
photons_pass_through_material.str <- rbinom(1, photons, 0.4)
#Probability that a photon is emitted from the x-ray and passes through the object
photons_pass_through_material.str/photons
```

```
## [1] 0.4059406
```

$$p(k, l) = P(X = k, Y = l) = P(X = k) * P(Y = l | X = k)$$

$$P(X = k) * P(Y = l | X = k) = \frac{100^k e^{-100}}{k!} * k! * (0.4)^l (0.6)^{k-l}$$

HW3.3

You have n random number generators where the i th draw from the generator is from the interval $[0, t_i]$ where t_i 's are positive integers. Let X_i be the number drawn by the i th random number generator

What is the expected sum. $S = X_1 + \dots + X_n$?

What is the expected value of Y , which is an indicator variable that counts for all X_i 's ≤ 1 ?

HW3.4

Let $X \sim \text{Exponential}(\lambda)$ and let t be a constant where: $0 < t < \lambda$

What is $E[e^{tX}]$?

Use the Markov inequality to prove a bound on $P(e^{tX} \geq \alpha)$ where α is a positive number

Now reformulate this into a bound on $P(X \geq b)$ How does this compare to the true value of the probability $P(X \geq b)$

HW3.5

Flip a coin 10 times and let X be the sequence 'HT'. What is $P(X = 0)$?

```
library(stringr)
set.seed(1929)
#Assigning variables
coin_sides <- c('H', 'T')
pat <- setNames(nm = "HT") #Pattern which we are looking for
prob <- c(0.5, 0.5) #The coin is fair
n_reps <- 50000 #Replicaitions of the Experiment
all_flips.df <- 0 #Zeroing out the data frame

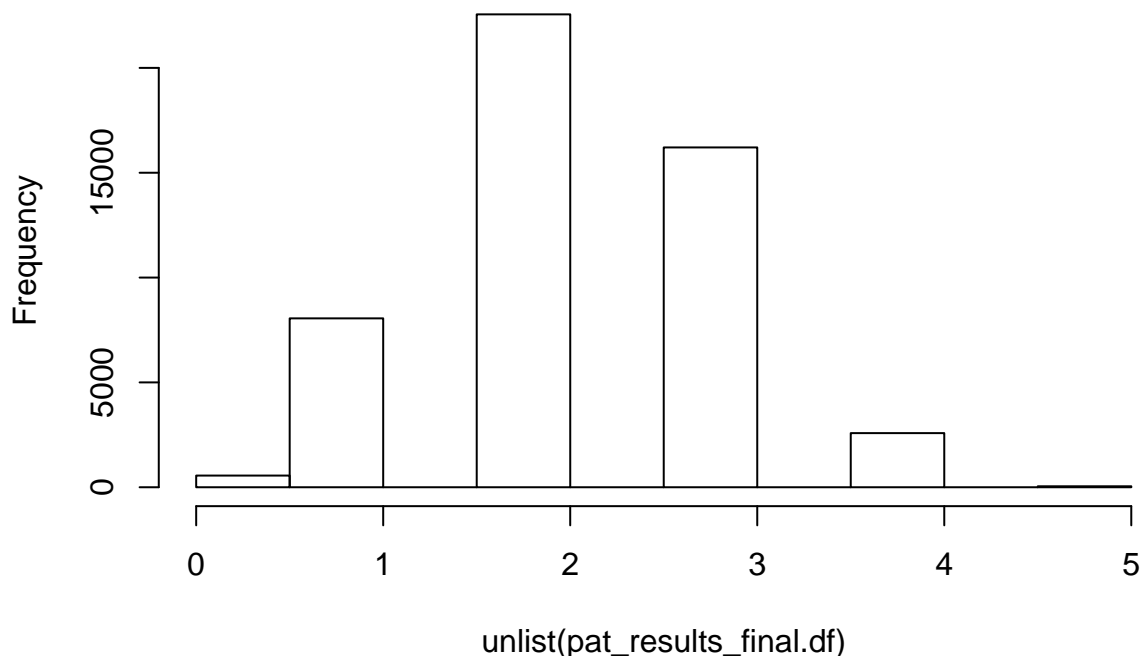
#A simple program which will toss the coin 'flips' times and record the results, creates a
# string from that data, and returns the number of times the pattern 'HT' is seen in the data
coin_pattern_toss <-function(flips){
all_flips.df <- data.frame(sample(coin_sides, flips, replace = TRUE, prob), stringsAsFactors = TRUE)
  names(all_flips.df) <- c('Coin')

all_flips.str <- paste(unlist(all_flips.df),collapse = '')
  pat_results.df <- data.frame(lapply(pat, str_count, string=all_flips.str))
return(pat_results.df)
}

#A large amount of 10 flip trials
pat_results_final.df <- data.frame(replicate(n_reps, coin_pattern_toss(10)))

#Histogram of the distrubuiton of pattern sucesses
hist(unlist(pat_results_final.df))
```

Histogram of unlist(pat_results_final.df)



```
#Tabulation of the number of successes in the pattern
pat_results_final.ls <- data.frame(table(unlist(pat_results_final.df)))
#Probability that P(X = 0)
(pat_results_final.ls[1,2]/n_reps)
```

```
## [1] 0.01114
```

What is the expectation $[E[X]]$?

The probability that the pattern 'HT' comes up once in the coin tosses is;

$P(\text{Heads and Tails}) = \frac{1}{2} * \frac{1}{2} = \frac{1}{4} = E_i$ Where i is 1-9 and if one was to calculate the expected value by weighing each coin toss by the probability and iterations we would see; $E(X) = E_1 + E_2 + \dots + E_9 = \sum_{i=1}^9 E_i = 9 * E_i = 9 * \frac{1}{4} = 2.25$

```
#Can be found using the weighted.mean function
x <- c(0, 1, 2, 3, 4, 5) #Number of patterns seen in ten flips
wt <- (pat_results_final.ls$Freq)/n_reps #Weighted rate of patterns seen
```

```
#Expected number of patterns
weighted.mean(pat_results_final.df)
```

```
## [1] 2.24682
```

If you were to draw one card at a time from a full deck without replacement what is the probability that you will NOT have the pattern 'RB'?

Use a hypergeometric distribution in order to determine the chance of drawing only black cards first.

$$P(X = 0) = \frac{\binom{K}{k} \binom{N-K}{n-k}}{\binom{N}{n}}$$

Where;

k = 26 | Successes

n = 26 | Draws

$N = 52$ | Number of objects in the Urn $K = 26$ | Number of Desired Object in the 'Urn'[Black Cards]

$$\therefore \frac{\binom{26}{26} \binom{26}{0}}{\binom{52}{26}} = 2.0164e^{-15}$$

Pseudocode; Perform this drawing action 50000 times using a string of R's and B's, do the same pattern searching as above, and then find the probability by density.

Notes: There is only one way for $P(Y = 0)$ and that is when all Black cards are drawn first.

```
library(stringr)
set.seed(1929)
pat <- setNames(nm = 'RB') #Pattern that we wish to observe
deck_attributes <- c(rep(c('R', 'B'), 26)) #Creation of a variable containing the card colours
n_reps <- 50000 #Number of reps for the simulation
cards_to_draw <- 52 #Number of cards to draw from the deck

#Creation of a colour deck data frame [Red and Black]
full_deck.df <- data.frame(deck_attributes)

#Function to draw cards from the deck and to record the number of times the pattern is seen
card_draw <- function(cards_to_draw){
draw_results.df <-
  data.frame(
    sample(full_deck.df$deck_attributes, cards_to_draw, replace = FALSE), stringsAsFactors = TRUE)
names(draw_results.df) <- c('Cards')

draw_results.str <- paste(unlist(draw_results.df), collapse = '')

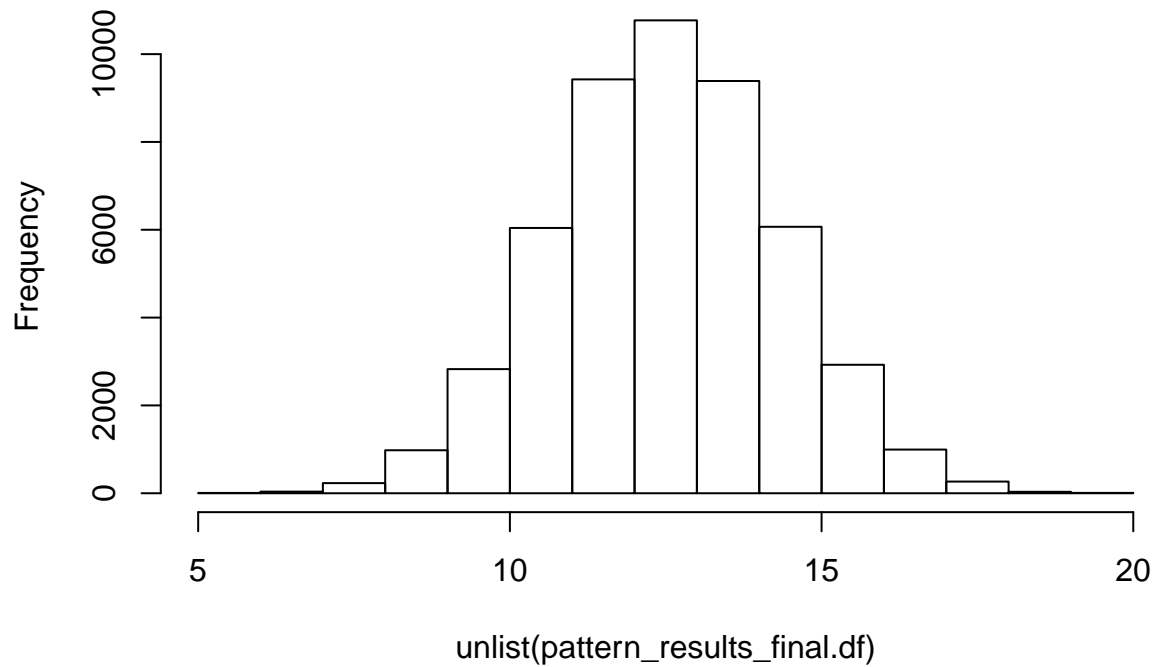
pattern_results.df <- data.frame(lapply(pat, str_count, string = draw_results.str))

return(pattern_results.df)
}

#Drawing the entire deck a large number of times
pattern_results_final.df <- data.frame(replicate(n_reps, card_draw(cards_to_draw)))

#Histogram of the results
hist(unlist(pattern_results_final.df))
```

Histogram of unlist(pattern_results_final.df)



```
#Transforming the data frame into a list
pattern_results_final.ls <- data.frame(table(unlist(pattern_results_final.df)))
#Probability that P(Y = 0) --- must have one trial come up as P(Y = 0) in the sim to use this
(pattern_results_final.ls[1,2]/n_reps)
```

```
## [1] 2e-05
```

As stated above using the hypergeometric distribution the chance of this being true is very low (2.0164×10^{-15}) so it may take 10^{15} trials until one comes up as $P(Y = 0)$.

What is $E(Y)$? Since the probability of achieving a 'RB' pattern is computed without replacement one needs take this into account. From the data obtained above from the simulation we can see that the weighted mean (according to the number of trials performed [50,000]) sits around 14 – so we should expect to see a similar or comparable result from using the rules for discrete estimation.

$$E[Y] = \sum_{i=1}^{51} 51 \frac{26}{52} \frac{26}{51} = 13$$

This answer is close to mean of 14 from the experiment above