



PROBABILITY PUZZLES IN R

Texas Hold'em

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Community Cards in Texas Hold'em





Two cards left to come

Outs: Cards that improve hand from losing to winning

Complement Rule: $P(A) = 1 - P(A^c)$

```
p_lose <- choose(10-3,2) / choose(10,2)
p_win <- 1 - p_lose
p_win
[1] 0.5333333
```



Calculating for different outs simultaneously

Using `choose` on a vector:

```
outs <- c(0,1,2,3)

p_lose <- choose(10-outs,2) / choose(10,2)
p_win <- 1 - p_lose
p_win
[1] 0.0000000 0.2000000 0.3777778 0.5333333
```



Expected values

$$E(X) = \sum_{\text{all values}} x \cdot P(X = x)$$

Coin flip wager:

```
probs <- c(0.5, 0.5)
values <- c(-2, 3)
probs * values
[1] -1  1.5
```

```
sum(probs * values)
[1] 0.5
```



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Let's do this!



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Consecutive Cashes in the World Series of Poker

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World Series of Poker

- ~ 6000 entrants in recent years
- Prize money awarded to top 10% - cashing

Poker Professional Ronnie Bardah:

- Cashed in 2010, 2011, 2012, 2013, 2014



Simplifying assumptions

- 6000 players every year
- Same players each year
- All player have identical ability



The intersection function

```
players <- c(1:20)
```

```
cash_year1 <- sample(players, 4)
cash_year1
[1] 20  4 11 14
```

```
cash_year2 <- sample(players, 4)
cash_year2
[1] 18  7 19  4
```

```
intersect(cash_year1, cash_year2)
[1] 4
```

Storing cashes as a matrix

```
players <- c(1:20)
```

```
cashes <- replicate(3, sample(players, 4))
```

```
cashes
```

	[,1]	[,2]	[,3]
[1,]	4	5	1
[2,]	11	19	6
[3,]	18	16	9
[4,]	12	14	17



The Reduce function

```
cashies <- replicate(3, sample(players, 4))
```

```
cashies
```

```
      [,1] [,2] [,3]  
[1,]    4    5    1  
[2,]   11   19    6  
[3,]   18   16    9  
[4,]   12   14   17
```

```
in_all_three <- Reduce(intersect, list(cashies[, 1], cashies[, 2], cashies[, 3]))
```

```
in_all_three  
integer(0)
```

```
length(in_all_three)  
[1] 0
```



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**Let's simulate the
World Series of Poker!**



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The von Neumann Model

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Uniform Random Variables

Each "hand" drawn from a Uniform(0,1) distribution.

```
runif(n, min = 0, max = 1)
```

```
runif(n = 1)  
[1] 0.5888486
```

```
playerA <- runif(n = 1)  
playerB <- runif(n = 1)  
playerA > playerB  
[1] TRUE
```

```
playerA  
[1] 0.6575921  
playerB  
[1] 0.3587836
```



Betting under the von Neumann model

Player B observes value, decides whether to wager \$1 or not

- If wagered, players compare values. Higher value wins \$1 from other player
- If not wagered: no money won or lost by either player



The ifelse function

Condition is true:

```
x <- 4
result <- ifelse(x > 0, sqrt(x), sqrt(-x))
result
[1] 2
```

Condition is false:

```
x <- (-4)
result <- ifelse(x > 0, sqrt(x), sqrt(-x))
result
[1] 2
```



The mean function, revisited

```
values <- replicate(10, roll_dice(3))  
values  
[1]  5 10 14  5 12 12  4 15  7  9
```

```
mean(values)  
[1] 9.3
```



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Your turn!



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Congratulations!

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Tools that you have learned

- Combinatorics
 - `choose(n, k)`
 - `factorial(n)`
- Simulation
 - `sample()`
 - `replicate()`
 - `runif()`
- Other functions
 - `else, ifelse`
 - `identical()`
 - `Reduce()`
- And more...



Where to go next

- More complex combinatorics questions
- Monte Carlo techniques
 - Markov chain Monte Carlo (MCMC)

Other DataCamp courses:

- Bayesian Modeling with RJAGS
- Statistical Simulation in Python



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Thank you!