# Lab 5

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## Contents

Examples	1
MLB 2021 Season Team-Game Data	1
Game-Level Independence Between Offensive & Defensive Performance	4
Your Work	6
## Date last run: 2022-05-08	
## Hello World!	

## Examples

Requires library xtable.

### MLB 2021 Season Team-Game Data

##	1	20210401 6346	615	Los Angeles	Dodgers	V	5	0	6	
##	2	20210401 6346	615	Colorado	Rockies	Н	8	0	4	
##	3	20210401 6346	618	Arizona Diamo	ondbacks	V	7	4	12	
##	4	20210401 6346	618	San Diego	Padres	Н	8	2	10	
##	5	20210401 6346	622	Atlanta	a Braves	V	2	1	10	
##	6	20210401 6346	622	Philadelphia F	Phillies	Н	3	0	13	
##		bat_baseOnBa	lls	pitch_runs pit	ch_homeR	uns pitch	_strikeOuts	pitch_bas	eOnBalls	
##	1		8	8		0	4		3	
##	2		3	5		0	6		8	

## 3	1	8	2	10	5
## 4	5	7	4	12	1
## 5	2	3	0	13	4
## 6	4	2	1	10	2

These included data sets were made by processing data obtained from MLB.

```
xbrks <- seq(-0.5, max(xdf[ , "bat_runs"])+0.5, by=1)
par(cex=0.65)
hist(xdf[ , "bat_runs"], breaks=xbrks, main="Team-Game Runs Scored, MLB 2021 Season")</pre>
```

#### Team-Game Runs Scored, MLB 2021 Season

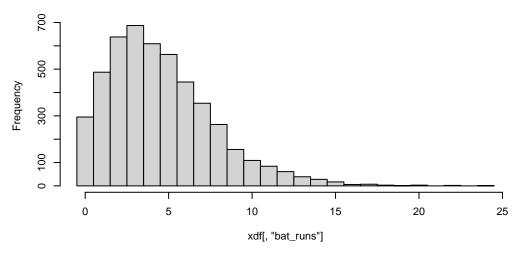


Figure 1: Distribution Team Runs scored by game.

Let's re-code runs scored (integer) into a two-level factor (a categorical attribute with two categories), "high" and "low".

If a team scores 5 or more runs, we'll call it "high"

```
xbruns <- xdf[ , "bat_runs"]

xcat_bruns <- c("low", "high")[ as.integer(xbruns >= 5) + 1 ]

xtbl <- table(xcat_bruns)[ c("low", "high") ]

xtbl

## xcat_bruns
## low high
## 2716 2142</pre>
```

Do the same thing for game-team runs allowed:

```
xpruns <- xdf[ , "pitch_runs"]</pre>
xcat_pruns <- c("low", "high")[ as.integer(xpruns >= 5) + 1 ]
xtbl2 <- table(xcat_pruns)[ c("low", "high") ]</pre>
xtbl2
## xcat_pruns
## low high
## 2716 2142
Of course, the distributions match.
Back to offense. Let's convert our frequency table into a proportions table.
xtbl_cellprops <- xtbl / sum(xtbl)</pre>
xtbl_cellprops
## xcat_bruns
##
         low
                    high
## 0.5590778 0.4409222
Make a bar chart:
par(cex=0.65)
barplot(xtbl_cellprops, main="Dist. of Low or High Offensive Output")
Let's call the occurrence (event) that a team has high offensive output "A"
And let's call the occurrence (event) that a team allows low opponent offense "B"
prop[A] = 0.44092
prop[B] = 0.55908
Let's calculate prop[A \cap B] and prop[A|B].
This will take some careful sub-setting in R.
totalAandB <- sum( xcat_bruns == "high" & xcat_pruns == "low" )</pre>
totalAandB
## [1] 1210
propAandB <- totalAandB / length(xcat_bruns)</pre>
propAandB
## [1] 0.2490737
```

#### Dist. of Low or High Offensive Output

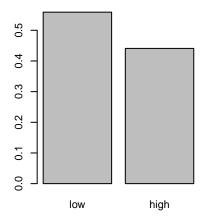


Figure 2: Distribution of Low or High Offensive Output.

```
#####

xmaskB <- xcat_pruns == "low"

xcat_bruns_givenB <- xcat_bruns[ xmaskB ]

propAgivenB <- sum( xcat_bruns_givenB == "high" ) / length(xcat_bruns_givenB)

propAgivenB

## [1] 0.4455081

prop[A \cap B] = 0.24907

prop[A|B] = 0.44551
```

#### Game-Level Independence Between Offensive & Defensive Performance

There is intuitive appeal that for most, if not all sports, at the game level, offensive and defensive performance are correlated.

To many fans, the success of the offense will be contagious and elevate the resolve and performance of the defense. And vice versa.

This question, that is, the dependence between game-level offensive and defensive performance is of considerable interest in sports analytics — especially handicapping. Yet this question, at least for baseball, is yet mostly unresolved.

Recall that if (and only if) event A and event B are independent, then  $\Pr[A \cap B] = \Pr[A] \cdot \Pr[B]$ 

Empirically, within a data set, occurrence A and occurrence B are independent (uncorrelated) if and only if  $prop[A \cap B] = prop[A] \cdot prop[B]$ 

Within our 2021 MLB season team-game level data, we see that the joint occurrence of strong offense and strong defense is 0.24907.

The product of the two respective marginal proportions is 0.44092 times 0.55908 equals 0.24651.

We can see that the joint proportion is slightly greater than the product of the two marginal proportions. This, by the way, tells us the two are positively correlated.

```
xindicatorA <- c("low"=0, "high"=1)[ xcat_bruns ]
xindicatorB <- c("low"=1, "high"=0)[ xcat_pruns ]
cor(xindicatorA, xindicatorB)</pre>
```

```
## [1] 0.01040072
```

Of course our data is a subset of actual baseball games played; it is an infinitesimal subset of all possible baseball games that could be played.

We can use empirical probabilities to test whether this very small positive effect reveals a genuine pattern within "all" baseball games, or might just be the result of chance.

```
nn <- 2000 ### number of experiments

xsim_joint_prob <- numeric(nn)

for(i in 1:nn) {
    xsim_bruns <- sample(xcat_bruns) #### randomly shuffle team-game runs scored
    xsim_joint_prob[i] <- sum( xcat_pruns == "low" & xsim_bruns == "high" ) / length(xcat_bruns)
}</pre>
```

```
par(cex=0.65)
hist(xsim_joint_prob, main="Simulated Joint Proportions of Strong Offense & Defense")
abline(v=propAandB, lwd=2, col="009900")
```

#### Simulated Joint Proportions of Strong Offense & Defense

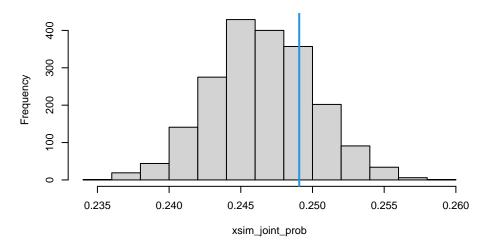


Figure 3: 2000 Simulations. Proportions of joint occurrence of Strong Offense & Defense under the assumption of independence. The blue line segment marks our actual observation.

### Your Work

Make sure to edit the "author" information in the YAML header near the top to include your name and UID.

Complete/answer the following.

Initial Library Loading

```
library(xtable)
library(tidyverse)
library(readxl)
library(ggthemes)
```

1 — Does our MLB team-game data represent "stacked" data? Why or why not?

This represents unstacked data because although the data is stacked together, there is no relationship between the entries. Each data in each row is independent from the next.

2 — Read in the NHL data and create a new numeric variable shots allowed. Now, re-code team shots into a 2-level categorical attribute. A value of 33 or more is 'high', otherwise, 'low'. Do the same thing for shots allowed.

```
##### here's a head start. Un-comment the following lines

## Shots
nhldf <- read.table("/Users/apurvashah/Documents/GitHub/stats10/lab5/NHL_20202021_teamGame.tsv", sep="\head(nhldf, n=6)</pre>
```

##	date	season	team	VorH	team_goals	team_pim	team_shots
##	1 20210113	20202021	Pittsburgh Penguins	VT	3	6	34
##	2 20210113	20202021	Philadelphia Flyers	HT	6	6	27
##	3 20210113	20202021	Chicago Blackhawks	VT	1	8	23

```
## 4 20210113 20202021 Tampa Bay Lightning
                                                   HT
                                                                5
                                                                           6
                                                                                      33
## 5 20210113 20202021 Montréal Canadiens
                                                   VT
                                                                4
                                                                          13
                                                                                      32
## 6 20210113 20202021 Toronto Maple Leafs
                                                   HT
                                                                5
                                                                          11
     team_powerPlayGoals team_powerPlayOpportunities team_blocked team_takeaways
## 1
                                                          3
                                                                       11
                                                                                          8
                          1
## 2
                          2
                                                          3
                                                                                          6
                                                                        13
## 3
                          1
                                                          3
                                                                        7
                                                                                          4
                          2
## 4
                                                          4
                                                                        12
                                                                                          4
## 5
                          2
                                                          3
                                                                        22
                                                                                          6
## 6
                          2
                                                          4
                                                                       17
                                                                                          5
##
     team_giveaways team_hits assists goals shots powerPlayGoals powerPlayAssists
## 1
                   10
                              23
                                        3
                                               3
                                                     34
## 2
                                               6
                                                     27
                                                                       2
                   10
                              31
                                       11
                                                                                           4
                                                     23
                                                                                           2
## 3
                    1
                              14
                                        2
                                               1
                                                                       1
## 4
                    1
                              16
                                       10
                                               5
                                                     33
                                                                       2
                                                                                           4
## 5
                   13
                              32
                                        8
                                               4
                                                     32
                                                                       2
                                                                                           4
## 6
                    9
                              14
                                        8
                                               5
                                                     34
                                                                       2
                                                                                           3
##
     {\tt penaltyMinutes} \ \ {\tt faceOffWins} \ \ {\tt faceoffTaken} \ \ {\tt shortHandedGoals} \ \ {\tt shortHandedAssists}
## 1
                    4
                                 21
                                               50
                                                                    0
                                                                                          0
## 2
                    6
                                 29
                                               50
                                                                    0
                                                                                          0
## 3
                    8
                                 28
                                               57
                                                                    0
                                                                                          0
## 4
                    6
                                 29
                                               57
                                                                    0
                                                                                          0
                                 29
                                                                                          0
## 5
                   13
                                               63
                                                                    0
                                 34
                                               63
                                                                    0
                                                                                          0
## 6
                    9
boom <- nhldf[ , "team_shots"]</pre>
shots \leftarrow c("low", "high")[as.integer(boom >= 33) + 1]
shots_table <- table(shots)[ c("low", "high") ]</pre>
## Shots Allowed
N <- nrow(nhldf)</pre>
cross_ndx \leftarrow 1:N + rep(c(1, -1), N/2)
xshots_allowed <- nhldf[ cross_ndx, "shots"]</pre>
shots_a <- c("low", "high")[ as.integer(xshots_allowed >= 33) + 1 ]
shots_allowed <- table(shots_a)[ c("low", "high") ]</pre>
##################
## Answers
##################
shots_table
## shots
## low high
## 1156 580
shots_allowed
## shots_a
## low high
## 1157 579
3 — Call high shots occurrence C, and low shots allowed occurrence D. Calculate the following:
```

a: Proportion of Cb: Proportion of D

c: Proportion of C and D

- d: Proportion of C given D
- e: Confirm that the proportion of C given D times the proportion of D equals the proportion of C and D.
- f: Write these results in-line and in context, and make sure to comment on the independence/dependence of C and D.

```
#shots
nhldf <- read.table("/Users/apurvashah/Documents/GitHub/stats10/lab5/NHL_20202021_teamGame.tsv", sep="\
boom <- nhldf[ , "team shots"]</pre>
bruns <- c("low", "high")[ as.integer(boom >= 33) + 1]
shots_table <- table(bruns)[ c("low", "high") ]</pre>
shots_table <- shots_table / sum(shots_table)</pre>
## Shots Allowed
N <- nrow(nhldf)</pre>
cross_ndx \leftarrow 1:N + rep(c(1, -1), N/2)
xshots_allowed <- nhldf[ cross_ndx, "shots"]</pre>
pruns <- c("low", "high")[ as.integer(xshots_allowed >= 33) + 1 ]
shots_allowed <- table(pruns)[ c("low", "high") ]</pre>
shots_allowed <- shots_allowed / sum(shots_allowed)</pre>
totalAandB <- sum(bruns == "high" & pruns == "low")</pre>
propAandB <- totalAandB/length(bruns)</pre>
xmaskB <- pruns == "low"</pre>
xcat_bruns_givenB <- bruns[xmaskB]</pre>
propAgivenB <- sum(xcat_bruns_givenB == "high") / length(xcat_bruns_givenB)</pre>
check <-propAgivenB*shots_table[1]</pre>
##################
## Answers
##################
paste("a: Proportion of C: ", shots_table[2], sep = " ")
## [1] "a: Proportion of C: 0.334101382488479"
paste("b: Proportion of D: ", shots_table[1], sep = " ")
## [1] "b: Proportion of D: 0.665898617511521"
paste("c: Proportion of C and D: ", propAandB, sep = " ")
## [1] "c: Proportion of C and D: 0.248847926267281"
paste("d: Proportion of C given D: ", propAgivenB, sep = " ")
## [1] "d: Proportion of C given D: 0.373379429559205"
paste("e: C given D * Prop D = Prop C and D", check, sep = " ")
## [1] "e: C given D * Prop D = Prop C and D 0.248632845950715"
```

your text r your text r ...

4 — Repeat 2 and 3 above for penalty minutes. Define high as 8 or more. Call team high penalty minutes occurrence G, and low opponent penalty minutes occurrence H.

nhldf <- read.table("/Users/apurvashah/Documents/GitHub/stats10/lab5/NHL\_20202021\_teamGame.tsv", sep="\head(nhldf)</pre>

```
##
                                          team VorH team_goals team_pim team_shots
          date
                 season
## 1 20210113 20202021 Pittsburgh Penguins
                                                                3
                                                                          6
                                                                                     34
## 2 20210113 20202021 Philadelphia Flyers
                                                                6
                                                                          6
                                                                                     27
## 3 20210113 20202021 Chicago Blackhawks
                                                                                     23
                                                  VT
                                                                1
                                                                          8
## 4 20210113 20202021 Tampa Bay Lightning
                                                  HT
                                                                5
                                                                          6
                                                                                     33
## 5 20210113 20202021 Montréal Canadiens
                                                                         13
                                                                                     32
                                                  VT
                                                                4
## 6 20210113 20202021 Toronto Maple Leafs
                                                                5
                                                                                     34
                                                  HT
                                                                         11
     team_powerPlayGoals team_powerPlayOpportunities team_blocked team_takeaways
## 1
                                                         3
                                                                       11
## 2
                          2
                                                         3
                                                                       13
                                                                                         6
## 3
                          1
                                                         3
                                                                       7
                                                                                         4
## 4
                          2
                                                         4
                                                                       12
                                                                                         4
## 5
                          2
                                                         3
                                                                       22
                                                                                         6
## 6
                          2
                                                                       17
                                                                                         5
##
     team_giveaways team_hits assists goals shots powerPlayGoals powerPlayAssists
## 1
                   10
                              23
                                        3
                                               3
## 2
                                                                       2
                   10
                              31
                                       11
                                               6
                                                    27
## 3
                              14
                                        2
                                               1
                                                    23
                                                                                          2
                    1
                                                                       1
## 4
                                       10
                                               5
                                                    33
                                                                       2
                                                                                          4
                              16
                    1
                                                                       2
## 5
                              32
                                        8
                                               4
                                                    32
                                                                                          4
                   13
                              14
                                                                       2
## 6
                    9
                                        8
                                               5
                                                    34
                                                                                          3
     {\tt penaltyMinutes} \ \ {\tt faceOffWins} \ \ {\tt faceoffTaken} \ \ {\tt shortHandedGoals} \ \ {\tt shortHandedAssists}
##
## 1
                    4
                                21
                                               50
                                                                   0
## 2
                    6
                                29
                                               50
                                                                                         0
                                                                   0
## 3
                    8
                                28
                                               57
                                                                   0
                                                                                         0
## 4
                    6
                                29
                                               57
                                                                   0
                                                                                         0
## 5
                   13
                                29
                                               63
                                                                   0
                                                                                         0
                                                                                         0
## 6
                    9
                                34
                                               63
                                                                   0
```

```
# Penalty Minutes Team
penalty_minutes <- nhldf[ , "team_pim"]
penal_highlow <- c("low", "high")[ as.integer(penalty_minutes >= 8) + 1 ]
team_table <- table(penal_highlow)[ c("low", "high") ]
actual_high <- team_table[2]
team_table <- team_table / sum(team_table)
## Penalty Minutes Other Team
other_penalty <- nhldf[ , "penaltyMinutes"]
other_penalty_min <- c("low", "high")[ as.integer(other_penalty >= 8) + 1 ]
other_min <- table(other_penalty_min)[ c("low", "high") ]
actual_low <- other_min[1]
other_min <- other_min / sum(other_min)

totalAandB <- sum(penal_highlow == "high" & other_penalty_min == "low")
propAandB <- totalAandB/length(penal_highlow)</pre>
```

```
xmaskB <- other penalty min == "low"</pre>
xcat_bruns_givenB <- penal_highlow[xmaskB]</pre>
propAgivenB <- sum(xcat_bruns_givenB == "high") / length(xcat_bruns_givenB)</pre>
check <- team_table[1]*propAgivenB</pre>
##################
## Answers
##################
paste("a: Proportion of C: ", team_table[2], sep = " ")
## [1] "a: Proportion of C: 0.496543778801843"
paste("b: Proportion of D: ", team_table[1], sep = " ")
## [1] "b: Proportion of D: 0.503456221198157"
paste("c: Proportion of C and D: ", propAandB, sep = " ")
## [1] "c: Proportion of C and D: 0.0282258064516129"
paste("d: Proportion of C given D: ", propAgivenB, sep = " ")
## [1] "d: Proportion of C given D: 0.0530877573131094"
paste("e: C given D * Prop D = Prop C and D", check, sep = " ")
## [1] "e: C given D * Prop D = Prop C and D 0.0267273616887429"
## f: The data is dependent because Prop C | D does not equal prop D * C.
paste("High team penalty minutes", actual_high, sep = " ")
## [1] "High team penalty minutes 862"
paste("Low Opponent team penalty minutes", actual low, sep = " ")
## [1] "Low Opponent team penalty minutes 923"
your text r your text r
Extra Credit:
```

5 — Examine our simulation in the above Examples Section — in particular, the code sample(xcat\_bruns). Explain in two or three sentences why this simulation assumes independence.

The simulation assumes independence because we take a sampling distribution of data that is independent already. The parameters that we input are independent and the sampling distrubition is the idea of all of the possible games that could ever exist and their proababilities. Thus it is independent.