# HW 2 Manually Graded: Upload PDF here

Graded

Student

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**Total Points** 

12.5 / 15 pts

**Ouestion 1** 

Question 2b 2 / 3 pts

Question 2b

2bi). Represents the number of Games that the Team played in that specific year

2bii). Granularity of the data is a specific team in a specific year.

To prove this notice that the fewest columns that uniquely identify each row in Teams is teamID and yearID:

1

Note that while franchID and yearID also uniquely identify each row, when you read the documentation you see that franchID is a primary key in another table, hence why it is included in this table. The data is not aggregated at the franchise level (franchises consists of the MLB team as well as associated minor league teams, and the minor league teams are not aggregated into this data).

2biii). Granularity of the data is a specific player on a specific team in a specific year. To prove this notice that the fewest columns that uniquely identify each row in Salaries is playerID, teamID and yearID:

```
salaries_df[["teamID", "yearID", "playerID"]].value_counts().max()
```

1

✓ - 1 pt 2b(iii) incorrect / Missing

# **Question 3a**

3a (2 pts)!

$$\sum_{i=1}^{n} (x_i - \bar{x}) = \sum_{i=1}^{n} x_i - \sum_{i=1}^{n} \bar{x}$$
 $= \sum_{i=1}^{n} x_i - n \cdot \bar{x}$ 
 $= \sum_{i=1}^{n} x_i - n \cdot \frac{1}{n} \cdot \sum_{i=1}^{n} x_i$ 
 $= \sum_{i=1}^{n} x_i - \sum_{i=1}^{n} x_i = 0$ 

**→** - 0.5 pts Incorrect or missing substitution



3b

To find local max/min we start by finding the value(s) of c such that f'(c)=0:

$$f(c) = \frac{1}{n} \sum_{i=1}^{n} (x_i - c)^2$$

$$f'(c) = \frac{d}{dc} \left( \frac{1}{n} \sum_{i=1}^{n} (x_i - c)^2 \right)$$

$$=rac{1}{n}\sum_{i=1}^{n}rac{d}{dc}(x_i-c)^2$$

$$=\frac{1}{n}\sum_{i=1}^{n}2(x_i-c)(-1)$$

$$=rac{-2}{n}\sum_{i=1}^n(x_i-c)$$

Setting this equal to 0 and solving for c:

$$f'(c) = 0$$

$$\implies -\frac{2}{n}\sum_{i=1}^{n}(x_i-c)=0$$

$$\implies \sum_{i=1}^n (x_i - c) = 0$$

$$\implies \sum_{i=1}^n x_i - \sum_{i=1}^n c = 0$$

$$\implies \sum_{i=1}^n x_i - nc = 0$$

$$\implies \sum_{i=1}^n x_i = nc$$

$$\Longrightarrow \boxed{c = rac{1}{n} \sum_{i=1}^n x_i = ar{x}}$$

To test if this is a max or min, we use the 2nd derivative test:

$$f''(c) = \frac{-2}{n} \sum_{i=1}^{n} \frac{d}{dc} (x_i - c)$$

$$=\frac{-2}{n}\sum_{i=1}^{n}(-1)$$

$$=\frac{-2}{n}(-1)(n)=2$$

Thus  $f''(ar{x})=2>0 \implies c=ar{x}$  is a minimum value

ightharpoonup – 1 m pt Incorrectly solved or did not demonstrate value is a min by calculating f''(c) greater than 0

Question 4b 2 / 2 pts

**SOLN:** likelihood =  $(p^{**4})^*(1-p)^{**6}$ 

(Notice this doesn't have  $\binom{10}{4}$  out front because we have been given one specific ordering (we aren't considering all possible orderings with 4 heads))

✓ - 0 pts Correct

Question 5

Question 4d 4 / 4 pts

**Solution:** 

$$\log(L(p)) = \log(p^4(1-p)^6) = 4\log(p) + 6\log(1-p).$$

$$\implies \frac{d}{dp} \left( \log(L(p)) = \frac{4}{p} - \frac{6}{1-p} \right)$$

Now we solve for where the derivative equals 0:

$$\frac{d}{dp}\left(\log(L(p)) = 0\right)$$

$$\implies \frac{4}{p} - \frac{6}{1-p} = 0$$

$$\implies \frac{4}{p} = \frac{6}{1-p}$$

$$\implies 6p = 4(1-p)$$

$$\implies 6p = 4 - 4p$$

$$\implies 10p = 4$$

$$\Longrightarrow \hat{p} = 0.4$$

✓ - 0 pts Correct or follows from likelihood function above.



# 0.1 Question 2b (5 pts)

Examine the structure, granularity and faithfulness of the datasets. (Hint: The common utility functions we covered in class will be useful here).

Then answer the following questions:

- i). What does the column G represent in the teams dataset? (For a description of the columns, see the documentation in the data folder).
- ii). What is the granularity of the teams.csv file?
- iii). What is the granularity of the salary.csv file?
- iv). How many rows and columns are in the teams dataset? Assign your answer to the variables team rows and team col below.
- v). How many rows and columns are in the salary dataset? Assign your answer to the variables salary\_rows and salary\_col below.
- vi). How many entries in the teams.csv file are missing Attendance Data? Assign your answer to the variable missing\_attendance below.

#### 0.1.1 Answer Cell for Questions 2b(i)(ii)(iii)

In this cell, answer questions 2b(i) - (iii) using Markdown (not code).

2b(i) Answer: Games played

2b(ii) Answer: General stats for all MLB teams by year. Columns of data include games played, hits, outs, etc.

2b(iii) Answer: Salary info by player, team, league, and year.

In the code cells below justify your answers to part (ii) and (iii) and then answer parts iv through vi

teamID Out[563]: yearID lgID franchID divID Rank G Ghome W DivWin WCWin LgWin WSWin 1995 AL BAL BAL E 3 144 72.0 71 73 N N N N



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                                CHC
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                 NL
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                                                      162 81.0
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          Name: count, Length: 834, dtype: int64
In [564]: sal_gran = salaries_df.value_counts()
          sal_gran
          # Show work in this cell justifying your answer to part 4a(iii) (hint: either use .value coun
Out[564]: yearID
                 teamID lgID playerID
                                           salary
          1985
                  ATL
                                barkele01 870000
                          NL
                                                       1
          2006
                  HOU
                          NL
                                quallch01 376000
                                                       1
                  KCA
                          AL
                                brownem01 1775000
                                                       1
                                berroan01 2000000
                                                       1
                                bautide01 335500
                                                       1
                                                      . .
          1996
                  KCA
                          AL
                                lockhke01 207500
                                                      1
                                lennopa01 120000
                                                       1
                                jacomja01 150000
                                                       1
                                huismri01 118000
                                                       1
          2016
                  WAS
                          NL
                                zimmery01 14000000
          Name: count, Length: 26428, dtype: int64
In [565]: # Solution Cell for 2a(iv) and 2a(v)
          #Use code to find the number of rows and columns in the teams data. Do not enter any values
          team_rows = teams_df.shape[0]
          team_col = teams_df.shape[1]
          salary_rows = salaries_df.shape[0]
          salary_col = salaries_df.shape[1]
In [566]: # Solution Cell for 2a(vi)
          \# Use code to find the number of rows in the Teams data that are missing attendance data
          missing_attendance = sum(teams_df["attendance"].isna())
          missing_attendance
```

162 81.0

162 81.0

81.0

162

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81 81

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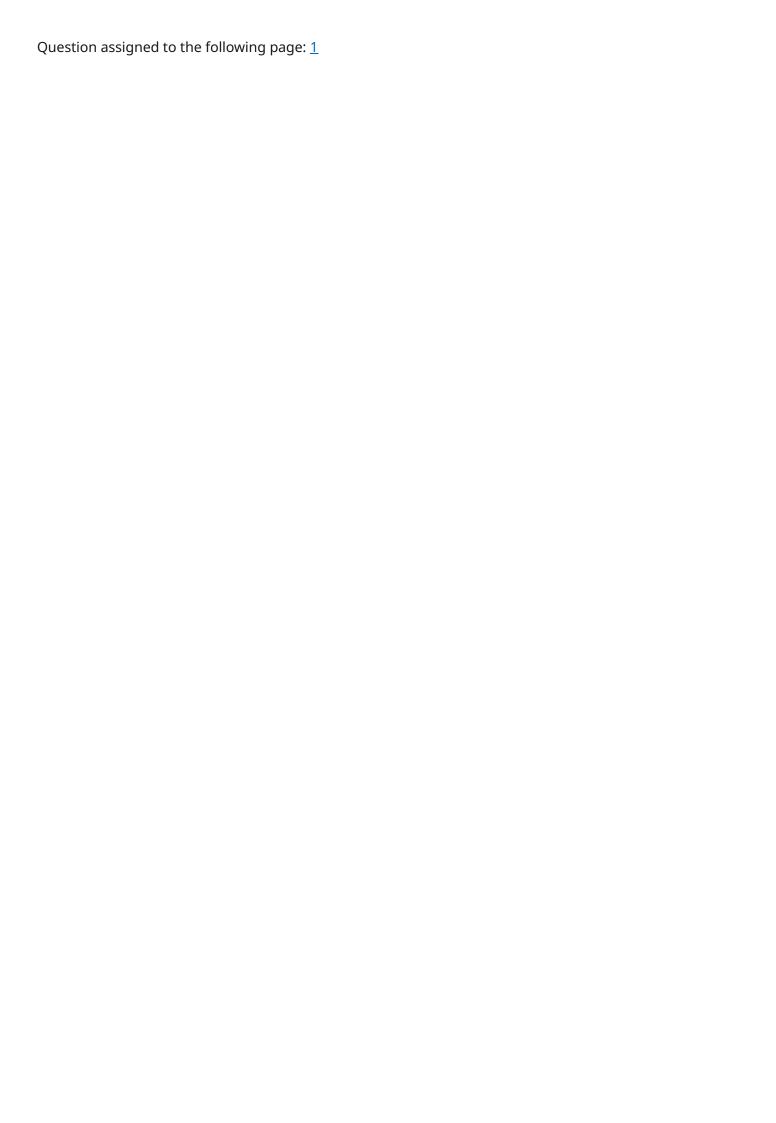
W

Ε

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2

1



```
Out[566]: 279
```

In [567]: grader.check("q2b")

Out[567]: q2b results: All test cases passed!



# 0.2 Question 3a (2 pts)

We commonly use sigma notation to compactly write the definition of the arithmetic mean (commonly known as the average):

$$\bar{x} = \frac{1}{n} \left( x_1 + x_2 + \ldots + x_n \right) = \frac{1}{n} \sum_{i=1}^n x_i$$

The *i*th deviation from average is the difference  $x_i - \bar{x}$ . Prove that the sum of all these deviations is 0 that is, prove that  $\sum_{i=1}^{n}(x_i - \bar{x}) = 0$  (write your full solution in the box directly below showing all steps and using LaTeX).

$$\sum_{i=1}^{n} x_i - \bar{x}$$

By using the summation rules defined above, we can split this summation into to two

$$\implies \sum_{i=1}^{n} x_i - \sum_{i=1}^{n} \bar{x}$$

because the summation of  $\bar{x}$  is  $\bar{x} + \bar{x} + ... + \bar{x}$  to n, we can simplify the second summation

$$\implies \sum_{i=1}^{n} x_i - n\bar{x}$$

we are given that  $\bar{x} = \frac{1}{n} \sum_{i=1}^n x_i$  we can substitute this for the variable  $\bar{x}$ 

$$\implies \sum_{i=1}^{n} x_i - n \sum_{i=1}^{n} \frac{1}{n} x_i$$

Since  $n \cdot \frac{1}{n}$  cancells out we are left with

$$\implies \sum_{i=1}^{n} x_i - \sum_{i=1}^{n} x_i = 0$$



# 0.3 Question 3b (4 pts)

Let  $x_1, x_2, \dots, x_n$  be a list of numbers. You can think of each index i as the label of a household, and the entry  $x_i$  as the annual income of Household i.

Consider the function

$$f(c) = \frac{1}{n} \sum_{i=1}^{n} (x_i - c)^2$$

In this scenario, suppose that our data points  $x_1, x_2, \dots, x_n$  are fixed and that c is the only variable.

Using calculus, determine the value of c that minimizes f(c). You must use calculus to justify that this is indeed a minimum, and not a maximum.

$$f'(c) = \tfrac{1}{n} \textstyle \sum_{i=1}^n (x_i - c)^2$$

 $=\frac{1}{n}\sum_{i=1}^{n}-2(x_i-c)$  by use of the chain rule

 $\frac{1}{n}\sum_{i=1}^{n}-2(x_i-c)=0$  set this equal to zero

 $\frac{1}{n}\sum_{i=1}^{n}2(x_{i}-c)=0$  multiply both sides by (-1)

 $\frac{1}{n}(2\sum_{i=1}^n x_i - 2\sum_{i=1}^n c) = 0$  by using the properties of summations.

 $\frac{1}{n}(2\sum_{i=1}^n x_i - 2c\sum_{i=1}^n 1) = 0$  since c is a constant, we can take it out of the summation.

 $\frac{2}{n}(\sum_{i=1}^n x_i - cn) = 0$  the summation of 1 is n. as well as factoring out the 2.

 $\frac{2}{n} \sum_{i=1}^n x_i - \frac{2}{n} cn = 0$  expanding the fraction.

$$\frac{2\sum_{i=1}^{n} x_i}{n} = 2c$$

 $\frac{\sum_{i=1}^{n} x_i}{n} = c$  divide by two.

This value is just  $c = \bar{x}$  proving that  $\bar{x}$  minimizes the function f(c).



What is L(p) (i.e. the likelihood) for the sequence TTTHTHHTTH?

Enter your answer below by setting the likelihood variable equal to the correct function.

(For example likelihood = sin(p)+2p, althought that is definitely an incorrect answer!)

Then run the code below to plot the likelihood function.

```
In [597]: #At the top of the notebook we already imported a useful plotting module, matplotlib with ali
    p = np.linspace(0, 1, 100)
    #This creates an array of 100 p-values equally spaced between 0 and 1

likelihood = pow(1-p, 6) * pow(p, 4)
    #Define the likelihood function above

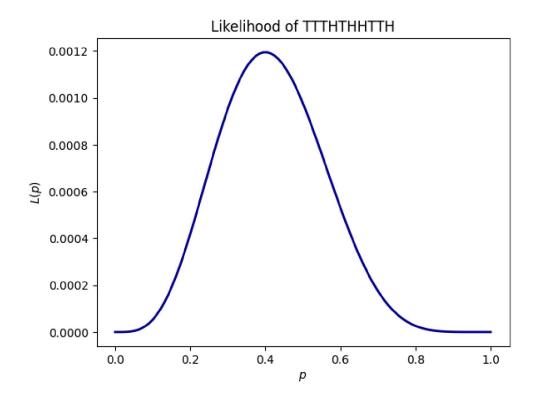
plt.plot(p, likelihood, lw=2, color='darkblue')
    #This plots the likelihood function

plt.xlabel('$p$')
    #This labels the x axis

plt.ylabel('$L(p)$')
    #This labels the y-axis

plt.title('Likelihood of TTTHTHHTTH');
    #This titles the plot
```







# 0.4 Question 4d (4 pts)

Notice the value you found graphically for  $\hat{p}$  above also intuitively makes sense because it is also the observed proportion of heads in the given sequence TTTHTHHTTH.

Let's prove what you observed graphically above. That is, let's use calculus to find  $\hat{p}$ .

But wait before you start trying to find the value p where L'(p)=0 (trust us, the algebra is not pretty...)

USEFUL TIP: The value  $\hat{p}$  at which the function L(p) attains its maximum is the same as the value at which the function  $\ln(L(p))$  attains its maximum.

This tip is hugely important in data science because many probabilities are products and the natural log function 1n function turns products into sums. It's much simpler to take derivatives of a sum than a product.

Thus, to find the value p where L'(p)=0: - Take the natural log ln of L(p) - Use properties of logs to rewrite products in ln(L(p)) as sums - Take the derivative of this rewritten version of ln(L(p)) - Solve  $\frac{d}{dp}[\ln(L(p))]=0$  for p - You should get the same answer that you found graphically above.

You don't have to check that the value you've found produces a max and not a min – we'll spare you that step.

Show all steps in the cell below using Markdown and LaTeX

$$\ln\left((1-p)^6\cdot p^4\right)$$

$$\implies \ln (1-p)^6 + \ln(p)^4$$

$$\implies 6\ln(1-p) + 4\ln(p)$$

$$\implies \frac{d}{dp}6\ln(1-p) + 4\ln(p) = 4\frac{1}{p} - 6\frac{1}{1-p}$$

$$\implies 4\frac{1}{p} - 6\frac{1}{1-p} = 0$$

$$\implies \frac{4}{p} = \frac{6}{1-p}$$

$$\implies 4(1-p) = 6p$$

$$\implies 4 - 4p = 6p$$



$$\implies 4 = 10p$$

$$\implies \frac{4}{10} = p$$