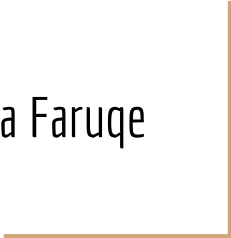


# BMI Score and Tricep Skinfold Thickness in Pima Dataset



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# Overview

- Background of Dataset
- Geomap
- Data Exploration
- Background Research
- SMART Question Development
- Epicycles of Analysis (before & after research)
- Methodology
- Correlation
- Tools
- Conclusion

# Background of Dataset - Pima.te

Population: Pima Indian women over 21 years old near Phoenix, Arizona

Sample: 332 randomly selected women from population

Source: US National Institute of Diabetes and Digestive and Kidney Diseases

R Package: MASS

The Pima Indian population near Phoenix, AZ has been under study by the NIDDKD since 1965 due to the population's high rate of diabetes.

# Geomap

Showing the location, gender and age group of “Pima” dataset using google chart



# Initial Variable Exploration (Variable Meanings)

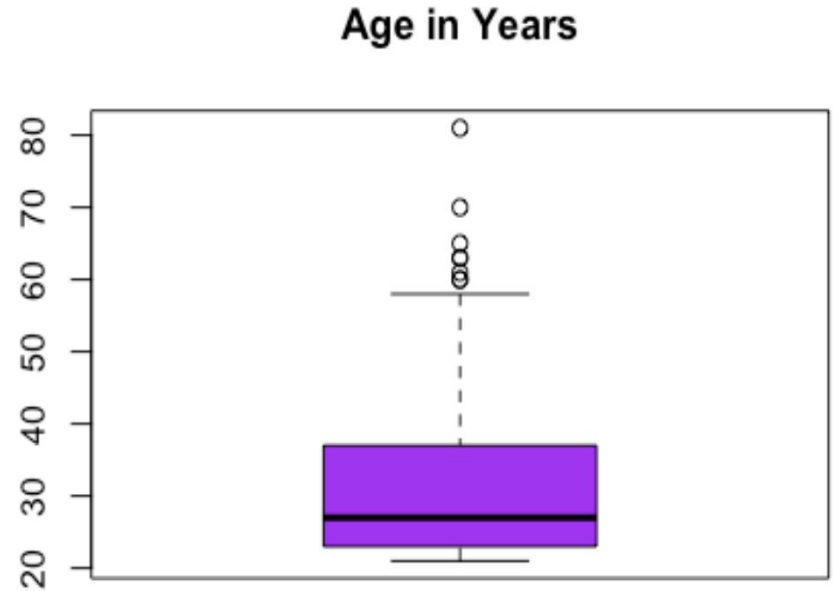
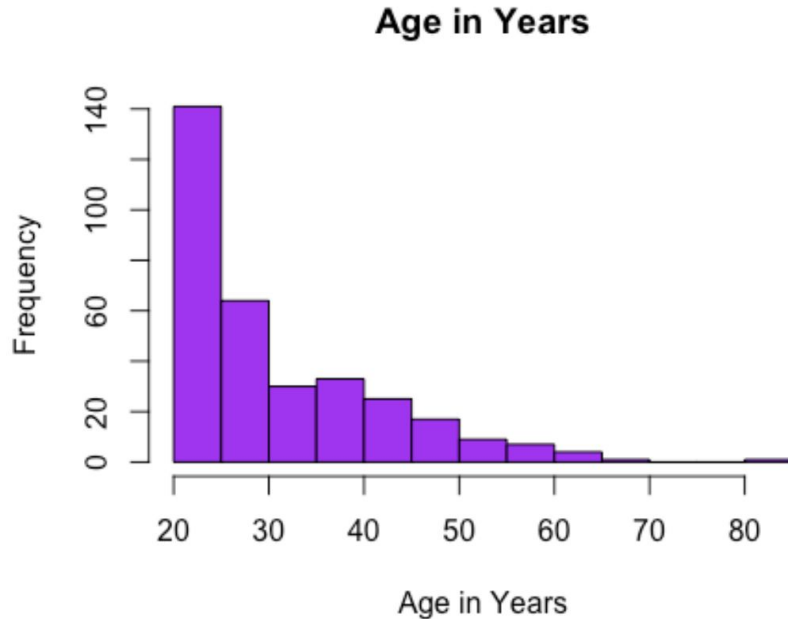
- Npreg: number of pregnancies
- Glu: plasma glucose concentration (blood sugar)
- Bp: diastolic blood pressure (mm Hg)
- Skin: triceps skinfold thickness (mm)
- Bmi: body mass index score
- Ped: diabetes pedigree function (based on genetic history of diabetes)
- Age: age in years
- Type (Yes or No): diabetic by WHO criteria (if the 2 hour post-load glucose was at least 200 mg/dl at any survey exam)

```
## 'data.frame': 332 obs. of 8 variables:  
## $ npreg: int 6 1 1 3 2 5 0 1 3 9 ...  
## $ glu : int 148 85 89 78 197 166 118 103 126 119 ...  
## $ bp : int 72 66 66 50 70 72 84 30 88 80 ...  
## $ skin : int 35 29 23 32 45 19 47 38 41 35 ...  
## $ bmi : num 33.6 26.6 28.1 31 30.5 25.8 45.8 43.3 39.3 29 ...  
## $ ped : num 0.627 0.351 0.167 0.248 0.158 0.587 0.551 0.183 0.704 0.263  
...  
## $ age : int 50 31 21 26 53 51 31 33 27 29 ...  
## $ type : Factor w/ 2 levels "No","Yes": 2 1 1 2 2 2 2 1 1 2 ...
```

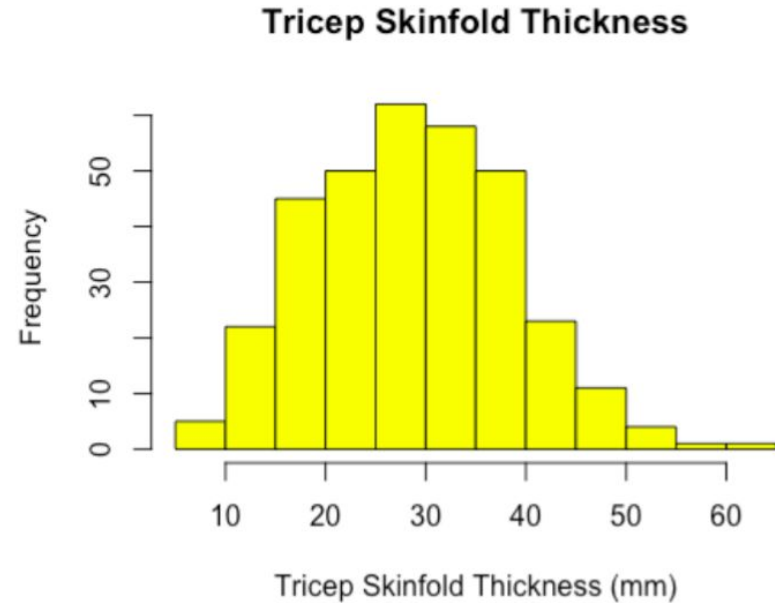
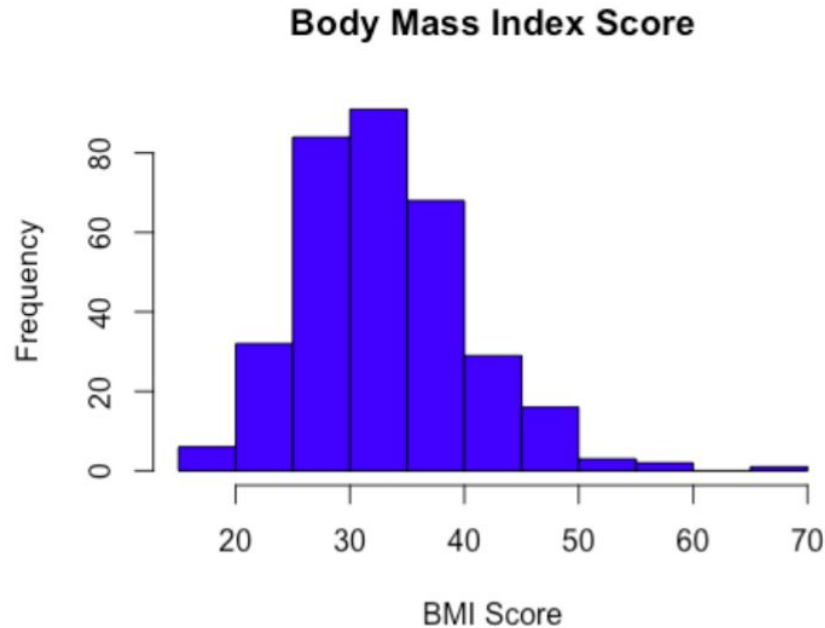
# Initial Variable Exploration (Descriptive Statistics)

	count	mean	std	min	25%	50%	75%	max
<b>npreg</b>	332.0	3.484940	3.283634	0.000	1.000	2.00	5.00000	17.00
<b>glu</b>	332.0	119.259036	30.501138	65.000	96.000	112.00	136.25000	197.00
<b>bp</b>	332.0	71.653614	12.799307	24.000	64.000	72.00	80.00000	110.00
<b>skin</b>	332.0	29.162651	9.748068	7.000	22.000	29.00	36.00000	63.00
<b>bmi</b>	332.0	33.239759	7.282901	19.400	28.175	32.90	37.20000	67.10
<b>ped</b>	332.0	0.528389	0.363278	0.085	0.266	0.44	0.67925	2.42
<b>age</b>	332.0	31.316265	10.636225	21.000	23.000	27.00	37.00000	81.00
<b>diab</b>	332.0	0.328313	0.470308	0.000	0.000	0.00	1.00000	1.00

# Initial Variable Exploration (Histograms and Boxplots)

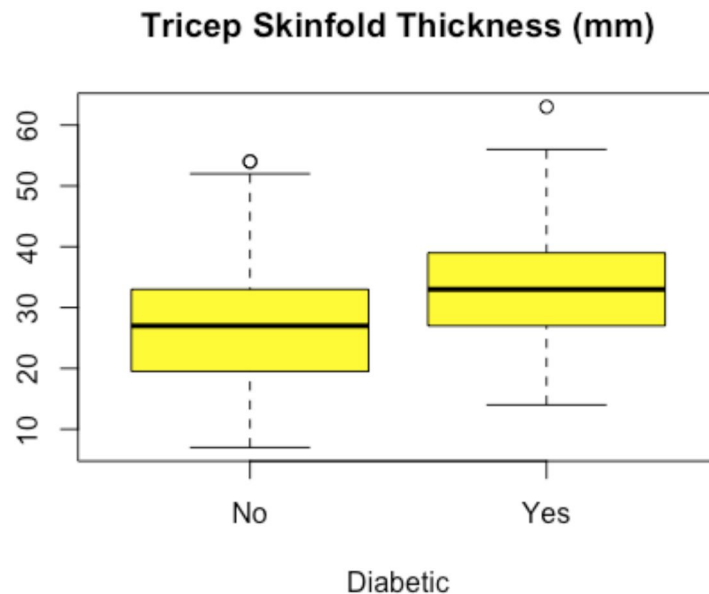
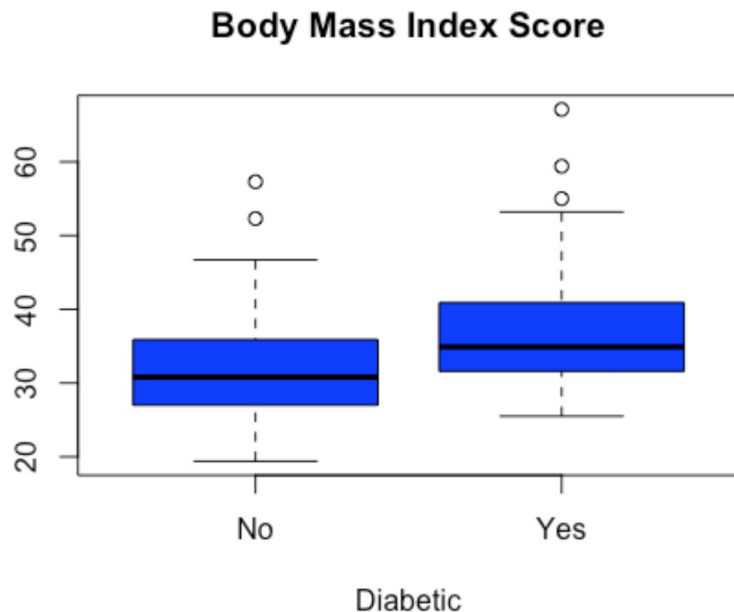


# Histograms of BMI and Triceps Skinfold Thickness





# BMI and Triceps Skinfold Thickness Exploration: Diabetic vs. Non-diabetic



# Background Research

- Body fat a known indicator of diabetes
- Diabetics are more likely to hold excess fat in abdomen

## Flaws in Two Variables

### **BMI Score:**

- Doesn't take into account lean tissue
- Overexaggerates thinness in short people and fatness in tall people

### **Triceps Skinfold Thickness:**

- Not meant to be a stand alone measurement
- Should be measured along with other skinfold areas

# SMART Question Development

**Are BMI score and triceps skinfold thickness strongly correlated ( $r > 0.7$ ) in the Pima dataset sample population of women?**

**Specific:** about a specific population of women, focused on two variables

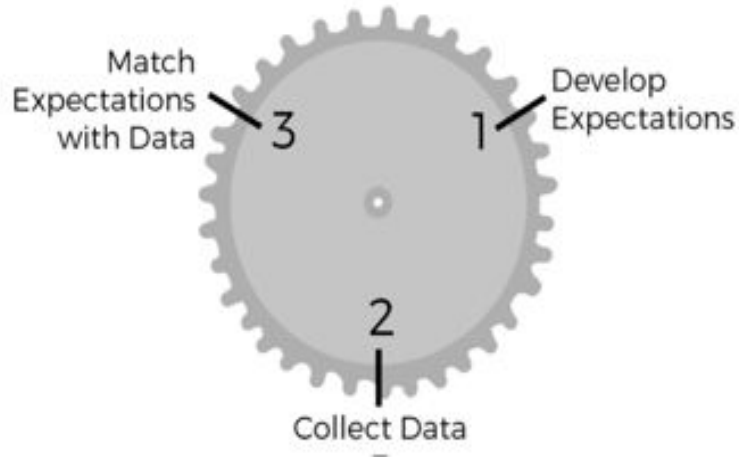
**Measurable:** can be measured with a correlation coefficient

**Answerable:** yes if ( $r > 0.7$ ), no if ( $r < 0.7$ )

**Relevant:** useful for researchers looking at relationship between BMI and triceps skinfold thickness

**Time bound:** data is already collected, so question can be answered in a timely manner

# Epicycles of Analysis



1. **Expectations:** BMI score and triceps skinfold thickness are positively correlated
2. **Data collection:** investigate pima dataset
3. **Match expectations with data:** Yes

# Goals of Programming (Easy to update)

## Defining a Function to Draw Histogram & Boxplot

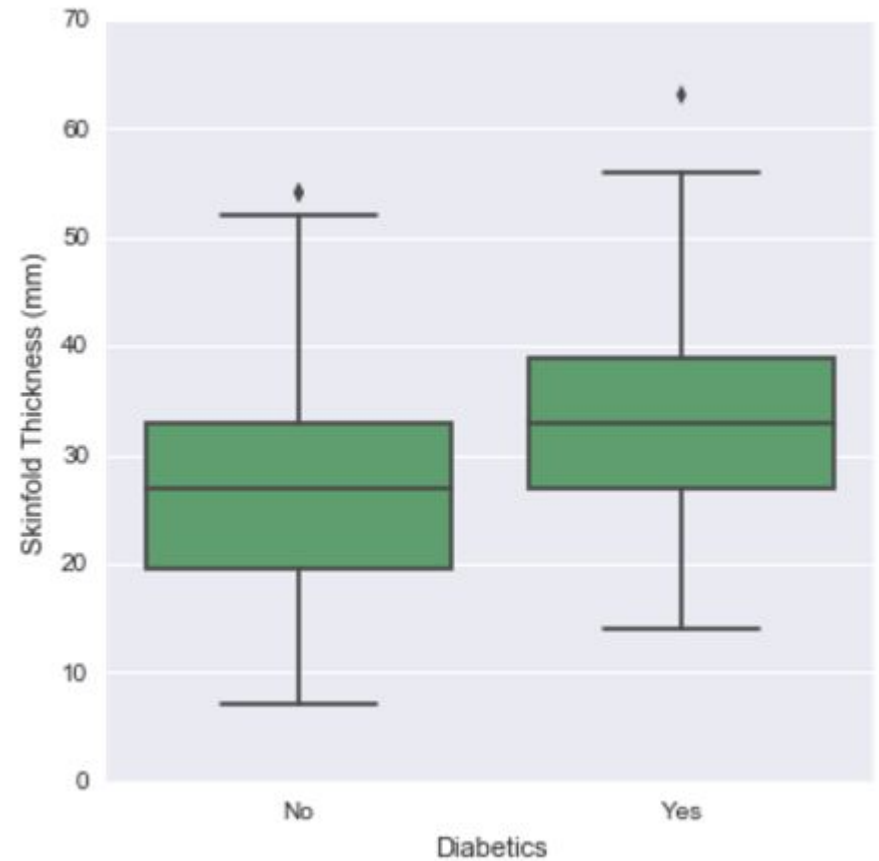
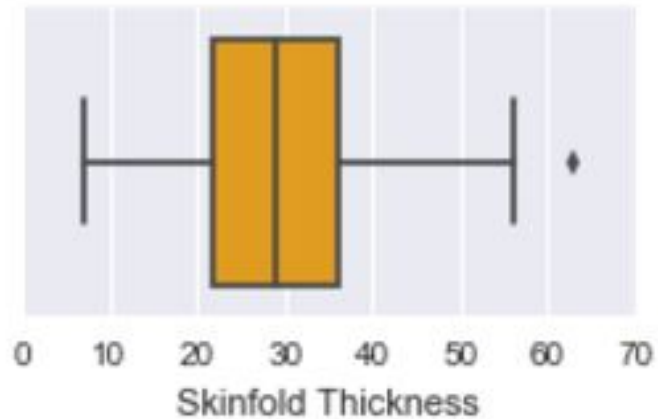
```
def drawhistbox(val,xaxis,col): ### passing data, title and color to draw histogram and boxplot
    hist = sns.FacetGrid(df, col="type")
    hist = hist.map(plt.hist, val, color=col)
    hist.set_titles("Diabetics: {col_name} ")
    hist.set_axis_labels(xaxis,"")

    box = sns.FacetGrid(df, col="type",col_order=["Yes", "No"],size=2, aspect=1.5)
    box = box.map(sns.boxplot, val, color=col)
    box.set_titles("")
    box.set_axis_labels(xaxis,"")
```

**Calling "drawhistbox" funtion to draw histogram & boxplot for five numeric variables**

```
drawhistbox("bmi", "Body Mass Index", "m")
drawhistbox("age", "Age", "y")
drawhistbox("bp", "Blood Pressure", "g")
drawhistbox("skin", "Skinfold Thickness", "orange")
drawhistbox("npreg", "Number of Pregnancies", "b")
```

# Example



# Interpret the Result

```
print("***** Correalation *****")

print("\nBody Mass Index & Triceps Skinfold Thickness")
typeofcorrelation(correlatoion(triceps_skinfold_thickness,bmi))
```

\*\*\*\*\* Correalation \*\*\*\*\*

Body Mass Index & Triceps Skinfold Thicknes  
Moderate Correlation: 0.658542792738

## Correlation

*Defining correlation function & interpret the type Of correlation*

```
def correlatoion(var1, var2):
    return(np.corrcoef(var1, var2)[1,0])

def typeofcorrelation(val):
    if val<.3:
        print("Weak Correlation: ", val)
    elif val>=.3 and val<.7:
        print("Moderate Correlation: ", val)
    elif val>=.7:
        print("Strong Correlation: ", val)
```

# Correlation

```
***** Correlation *****
```

```
Body Mass Index & Triceps Skinfold Thickness  
Moderate Correlation: 0.658542792738
```



# Goals of Programming (Make code readable)

## Drawing Scatterplot Triceps Skinfold Thickness vs BMI with "colorCategorizedBMI" & Plot Function

*Getting scatterplot of tricep skinfold thickness by BMI score for all observations, color coding based on BMI weight categories:*

#if BMI is less than 25.0 then

#Normal

#elseif BMI is between 25.0-29.9 then

#Obese

#elseif BMI is between 30.0-39.9 then

#Overweight

#elseif BMI is greater than or equal to 40.0 then

#Extremely obese

### Defining a function which will return color based on logic to draw a plot

```
color=[]  
def colorCategorizedBMI(): ## assign color based on bmi category  
    for i in range(len(bmi)):  
        if bmi[i]<=25:  
            color.append("green")  
        elif bmi[i]>25 and bmi[i]<=29:  
            color.append("yellow")  
        elif bmi[i]>29 and bmi[i]<=39.9:  
            color.append("orange")  
        elif bmi[i]>=40:  
            color.append("red")  
    return color
```

# Scatterplot of BMI vs Triceps Skinfold Thickness (color coded BMI)



# Tools, Packages & Charts

- R
- Python
- Google chart
- [jsreportstudio](#)
- Packages:
  - Numpy, pandas, statistics, matplotlib, seaborn, collections,
- Charts:
  - Histogram
  - Boxplot
  - Scatter plot
  - Geomap

# Conclusion

SMART Question: Are BMI score and triceps skinfold thickness strongly correlated ( $r > 0.7$ ) in the Pima dataset sample population of women?

BMI and tricep skinfold thickness are not strongly correlated ( $r = 0.66$ ). We can come to the conclusion that one or both methods (BMI and Tricep Skinfold Thickness) are not strong indicators for body fat.

# Questions



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