

# Women Who Exercise

Torrey Capobianco  
Bellevue University  
Exploratory Data Analysis  
Fall 2019

# Hypothesis

Women who have children under the age of 18 exercise less than women who do not have children under the age of 18.

# The Data

American Time Use Survey  
2003-2015

US Bureau of Labor Statistics

# Exercise Data

Who?

This analysis looks at exercise durations of females recorded in a single day.

What is considered exercise?

Durations recorded were taken from category “Participating in Sports, Exercise, and Recreation.” Due to this analysis looking at higher pace exercise activities, recreation activities such as playing billiards, fishing, hunting, vehicle touring/racing were removed from the data.

# Variable Selection

## Classification Variables

**tucaseid:**

case ID for respondent

**tesex:**

sex of respondent

**trtier1p:**

activity category 1st hierarchy

**trtier2p:**

activity category 2nd hierarchy

**trcodep:**

6 digit activity code

## Analysis Variables

**trchildnum:**

number of children for respondent

**tehruslt:**

usual hours worked per week for respondent

**tespuhrs:**

usual hours worked per week for respondent's spouse

**teage:**

age of respondent

**tuactdur24:**

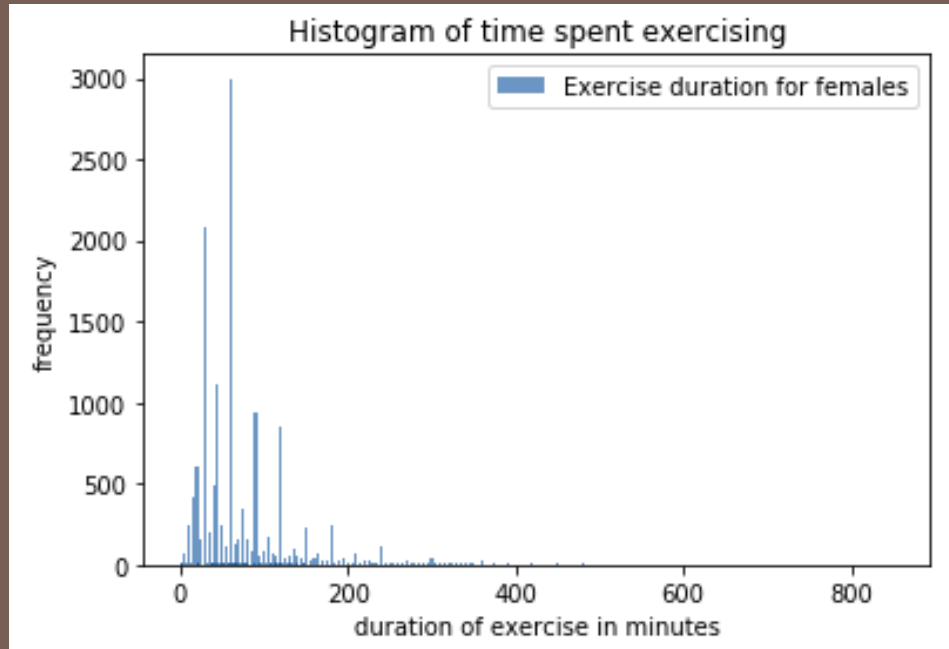
duration of activity in minutes

# Histograms

Histograms and descriptive characteristics

# Time spent exercising

tuactdur24



Mean: 77.38 minutes

Mode: 60 minutes

Variance: 4676.86

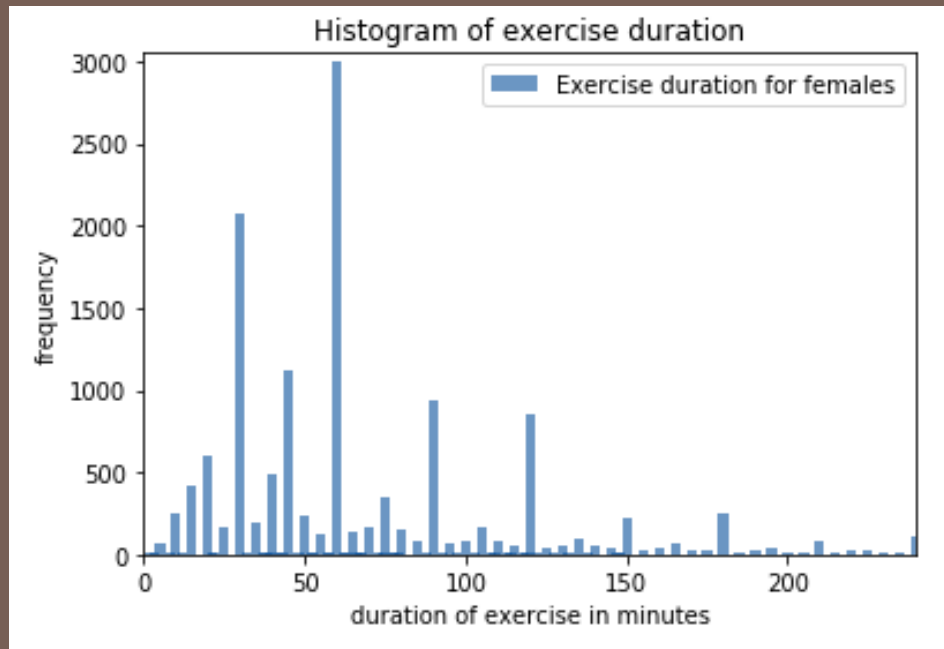
Standard Deviation: 68.37

The histogram is left skewed with most of the time spent exercising in the left tail with the right tail extending far to the right.

Outliers: There are cases of recorded exercise up to 15 hours in a day. This seems unreasonable. For this analysis all records greater than 240 minutes or 4 hours is removed.

# Time spent exercising

tuactdur24 – removed outliers



Mean: 68.51 minutes

Mode: 60 minutes

Variance: 2198.39

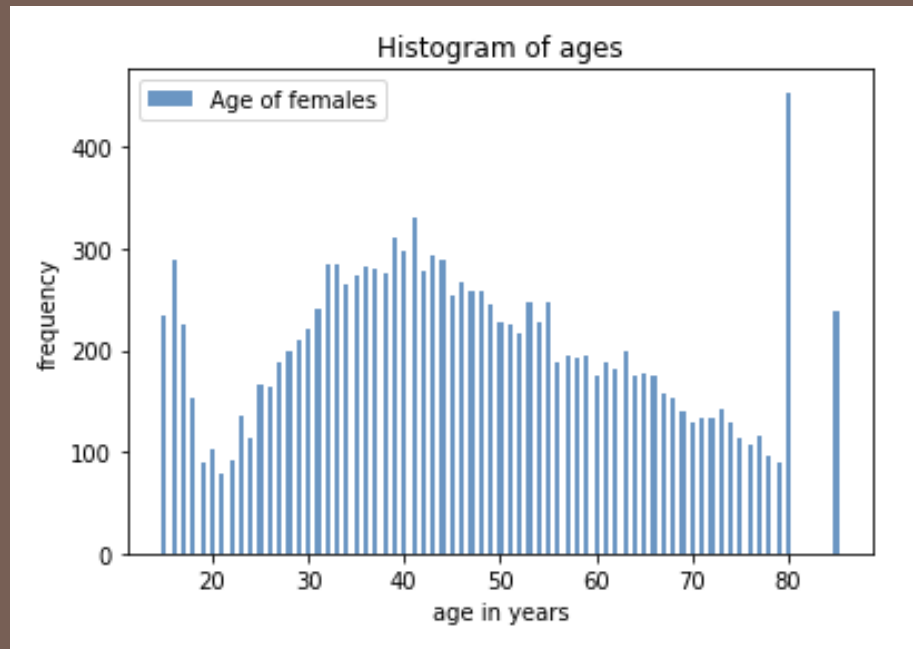
Standard Deviation: 46.89

The histogram is left skewed with most of the time spent exercising in the left tail with the right tail extending far to the right.



# Age

teage



Mean: 46.96 years

Mode: 80 years

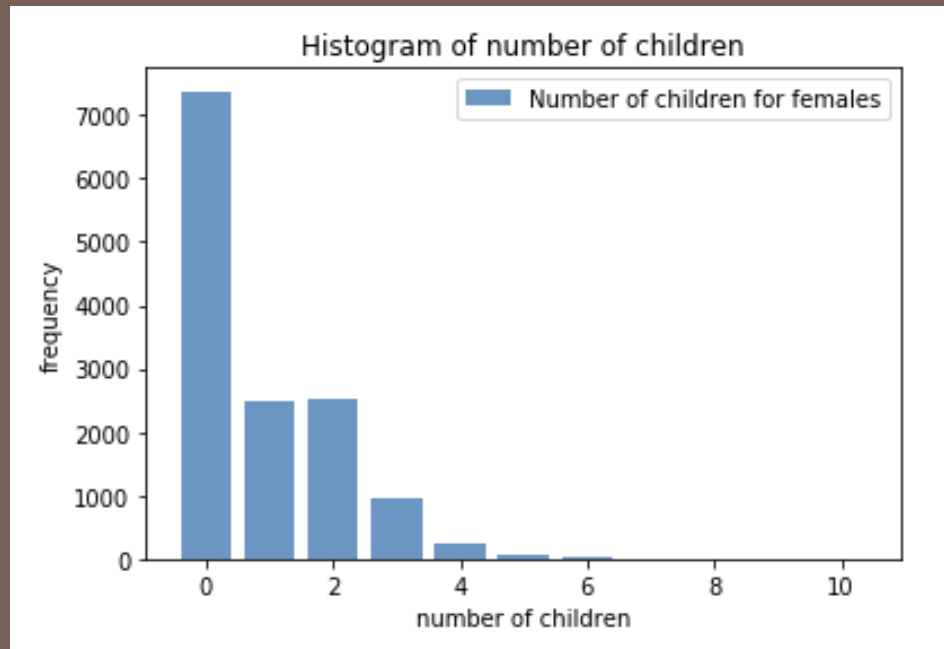
Variance: 326.58

Standard Deviation: 18.07

The histogram is multimodal, with a range with females less than their 20's, mid 40's, and the right tail their 80's.

# Number of children

trchildnum



Mean: 0.87 children

Mode: 0 children

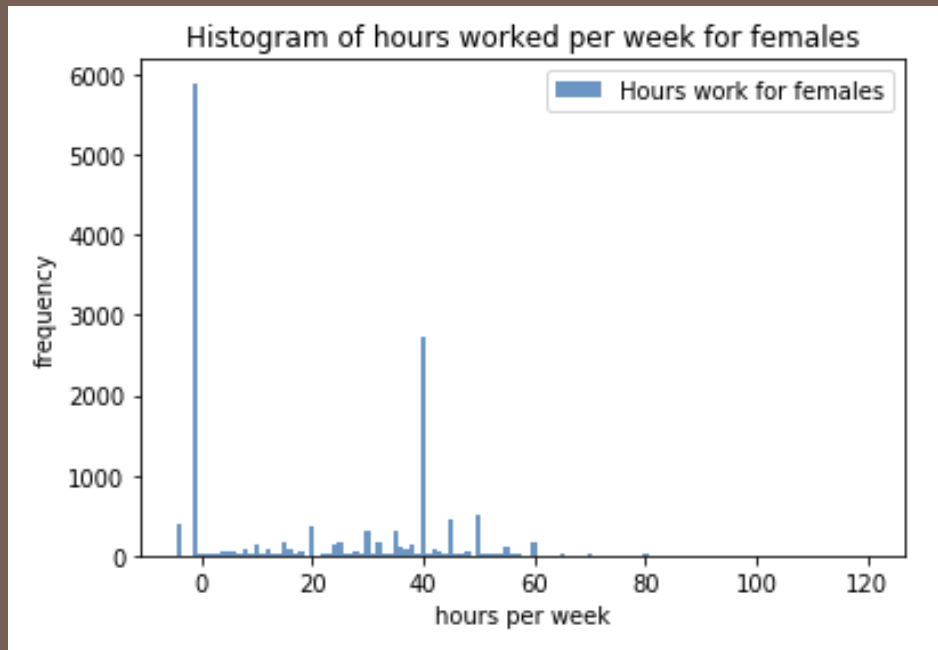
Variance: 1.28

Standard Deviation: 1.13

The histogram is left negative skewed with a tail extending far to the right.

# Usual hours work per week

tehruslt



Mean: 19.05 hours  
Mode: -1 (does not work)  
Variance: 443.08  
Standard Deviation: 21.05

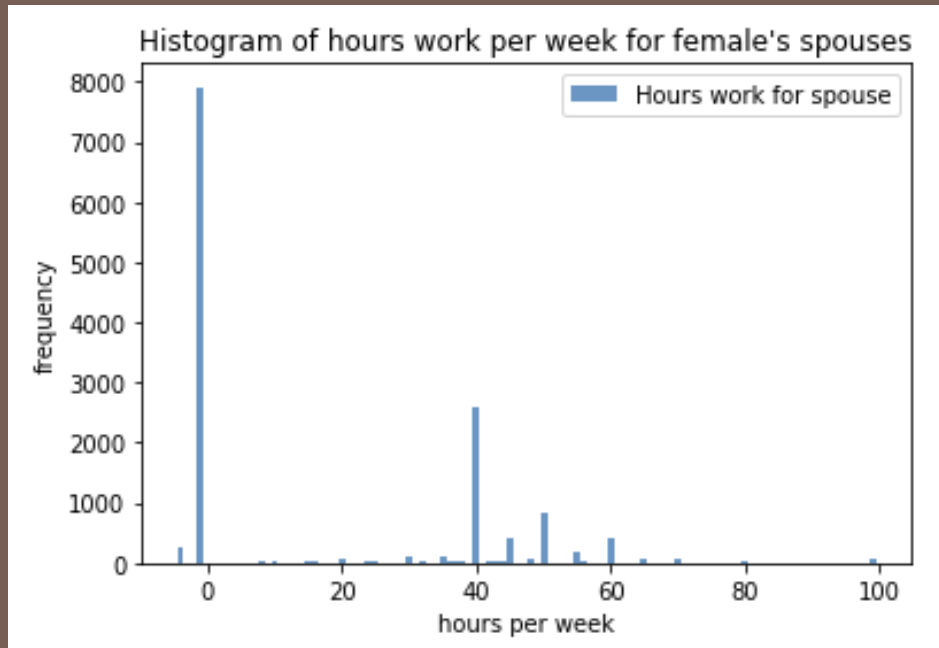
The histogram is binominal, with two peaks at -1 (does not work) and 40 hours.

Respondent answer of -4 indicates hours vary.

Respondent answer of -1 indicates does not work.

# Usual hours work per week for spouse

tespuhrs



Mean: 17.33 hours  
Mode: -1 (does not work)  
Variance: 563.63  
Standard Deviation: 23.74

The histogram is binominal, with two peaks at -1 (does not work) and 40 hours.

Respondent answer of -4 indicates hours vary.

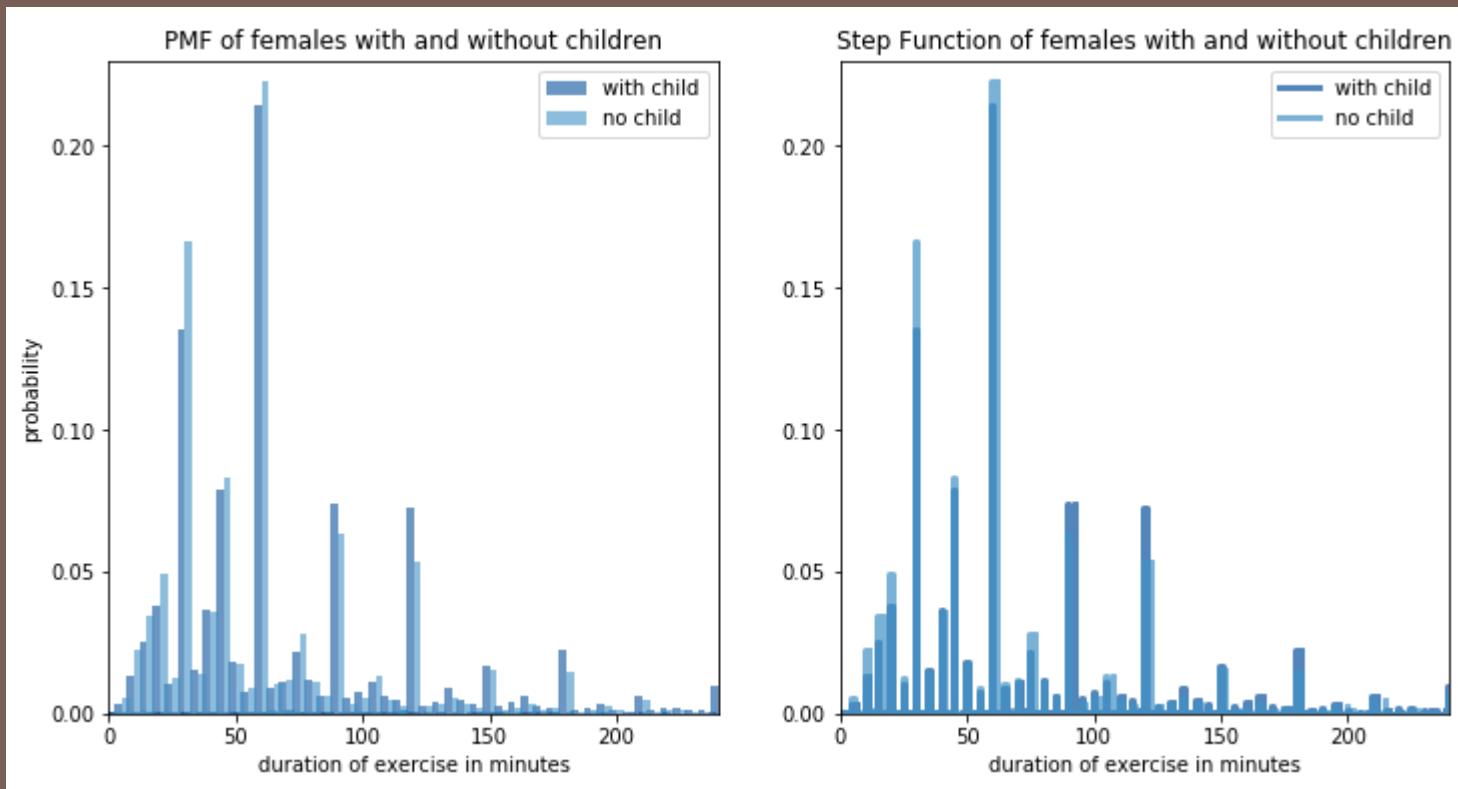
Respondent answer of -1 indicates does not work.

# Probability Mass Function

Comparing two scenarios with PMF

# PMF of female exercise duration

## Females with and without children



Exercise Duration	With Child	No Child
Mean	73.34	64.36
Variance	2401.37	1987.65
Standard Deviation	49.00	44.58

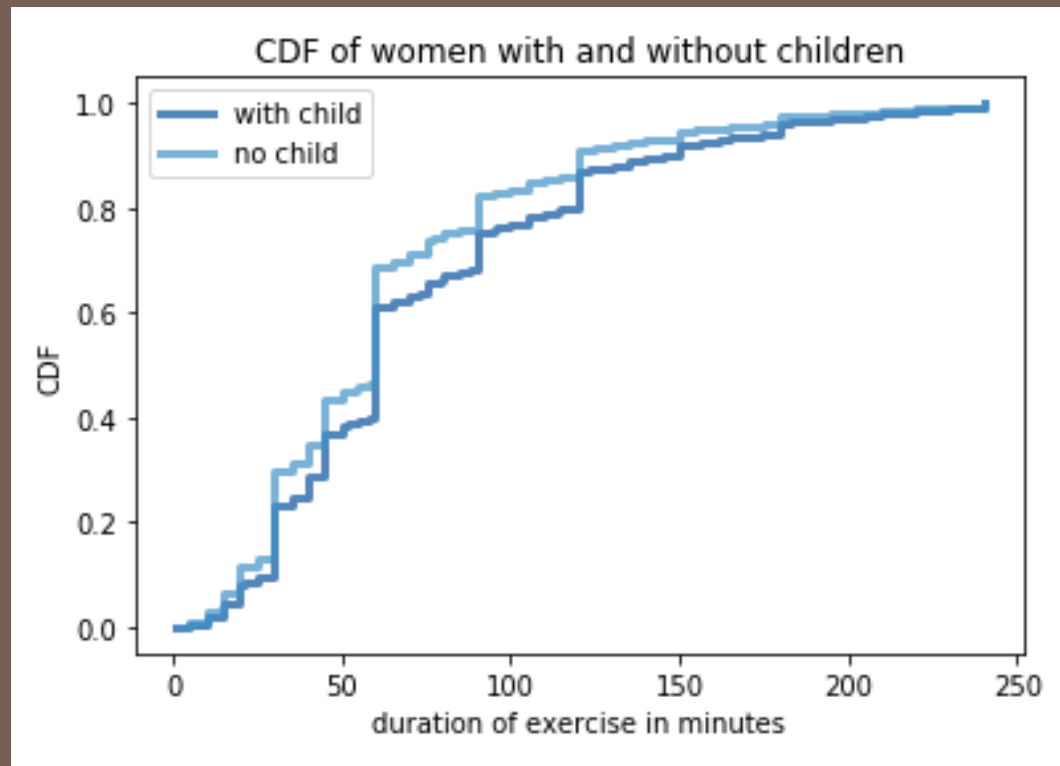
The probability that females with children exercising for shorter durations is smaller than those without children. Compared to longer durations, they have a higher probability than those without children.

# Cumulative Distribution Function

Comparing two scenarios with CDF

# CDF of female exercise duration

## Females with and without children



Exercise Duration	With Child	No Child
$\leq 100$ minutes	78 %	82 %
$\leq 60$ minutes	60 %	60 %
$\leq 50$ minutes	39 %	45 %
$\leq 30$ minutes	25 %	25 %

The CDF of exercise duration for females with children and no children are common in some durations. Once past 60 minutes, females without children have a higher cumulative probability of exercising more.

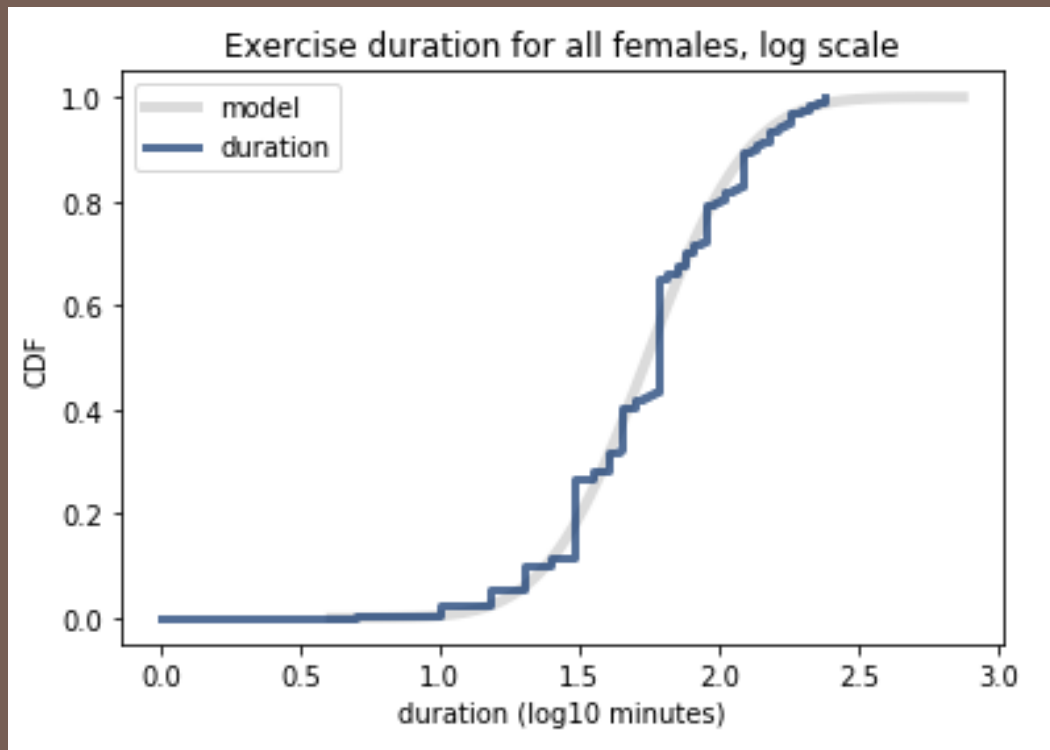


# Analytical Distribution

Lognormal distribution

# Lognormal Distribution

## Exercise duration for all females



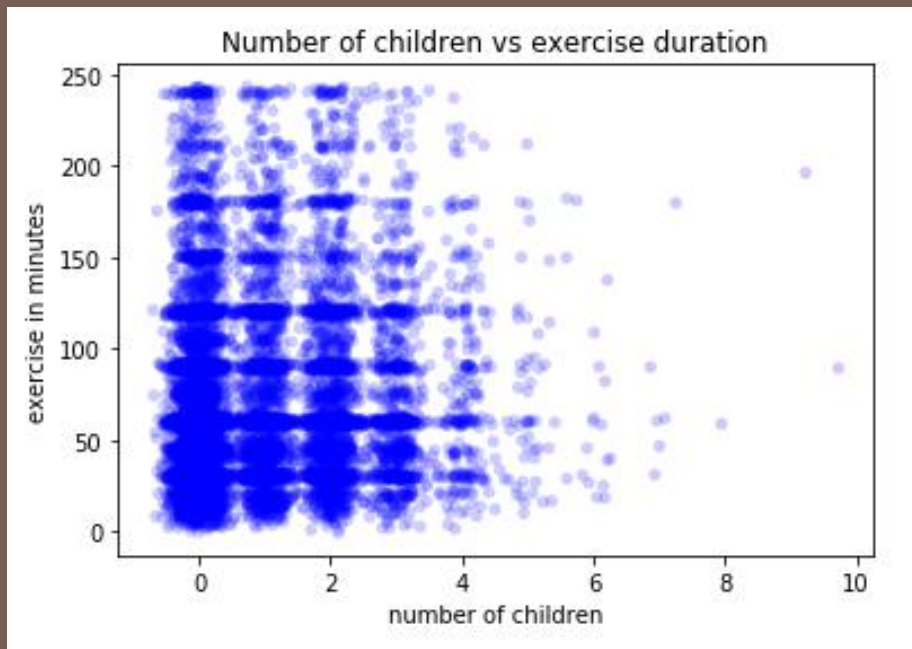
Lognormal distribution is the best fit for modeling the exercise duration of females.

# Variable Relationships

Scatter plots, covariance, and correlation.

# Number of children vs Exercise duration

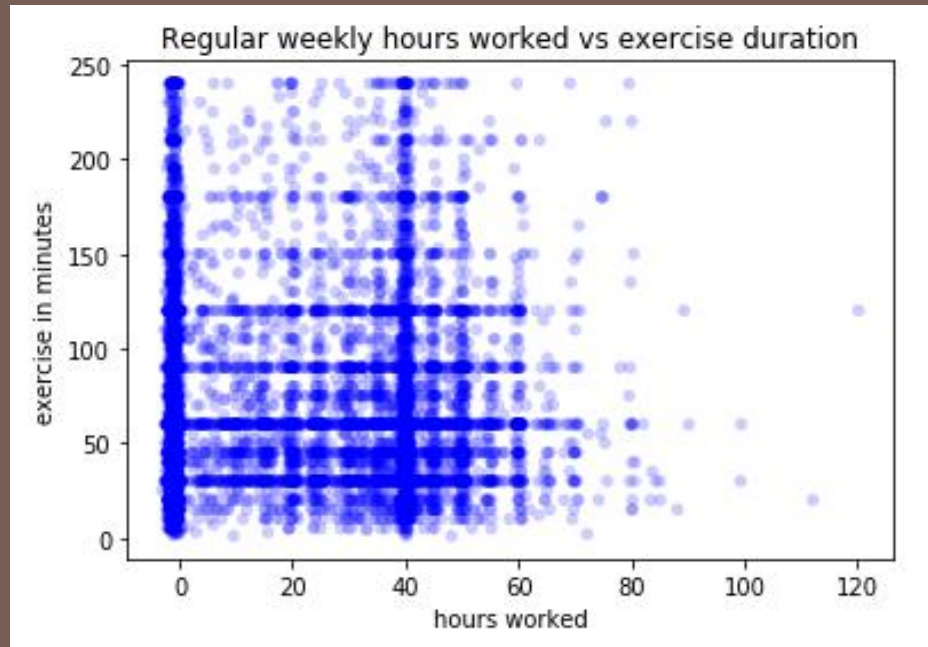
## Scatter Plot



	Result	Interpretation
Covariance	4.54	Positive, variables move in the same direction
Pearson's Correlation	0.08	Close to zero, no relationship between variables
Spearman's Rank Correlation	0.08	Close to zero, no relationship between variables

# Number of hours work vs Exercise duration

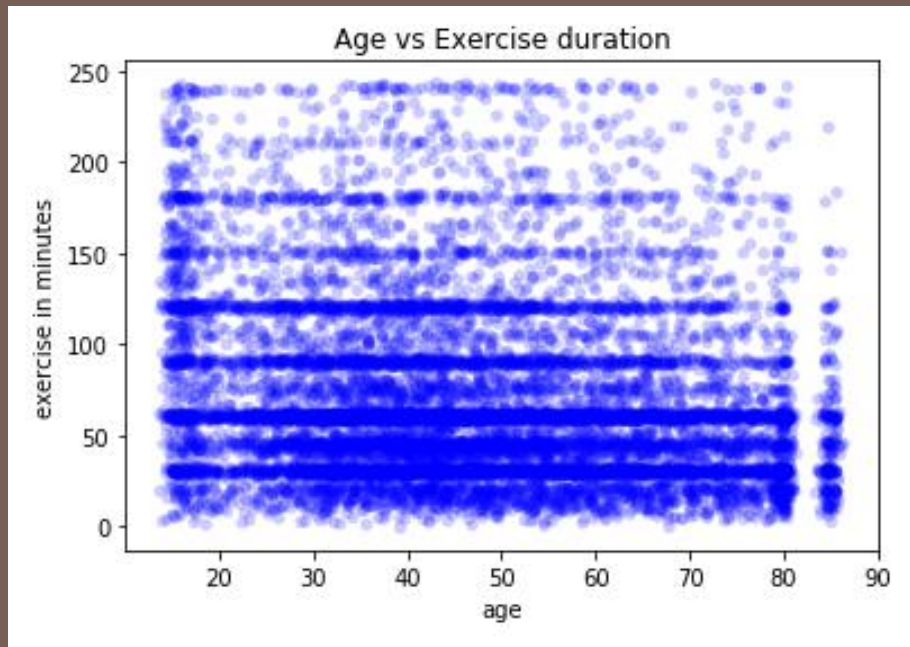
## Scatter Plot



	Result	Interpretation
Covariance	-8.33	Negative, variables move inversely
Pearson's Correlation	-0.008	Close to zero, no relationship between variables
Spearman's Rank Correlation	0.003	Close to zero, no relationship between variables

# Age vs Exercise duration

## Scatter Plot



	Result	Interpretation
Covariance	-160.5	Negative, variables move inversely
Pearson's Correlation	-0.19	Close to zero, no relationship between variables
Spearman's Rank Correlation	-0.19	Close to zero, no relationship between variables

# Hypothesis Test

Permutation difference of the means.

# Women with children exercise less than those without

## Null Hypothesis:

There is no difference in exercise habits between women with children under the age of 18 and women without children.

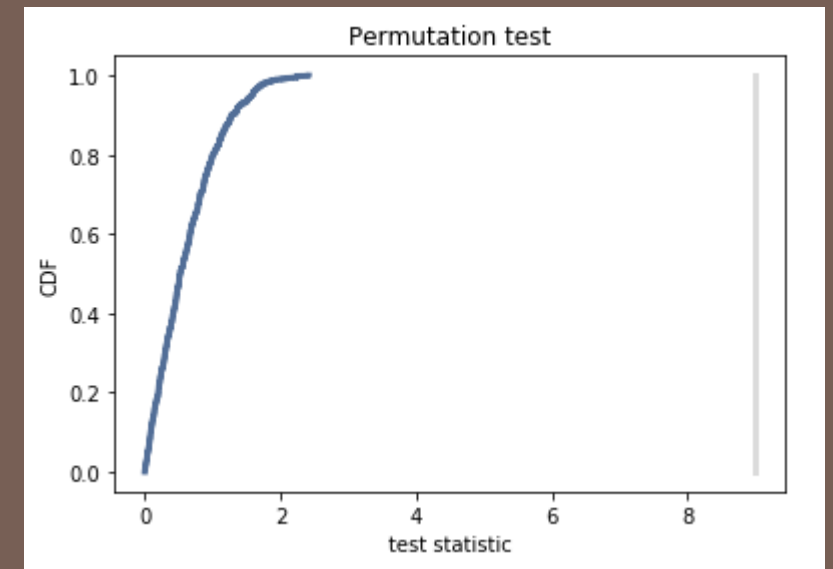
## Permutation Difference of the Means:

P-Value: 0.0

## Conclusion:

P-value is less than 1%. The effect is likely not due to chance.

- Reject the null hypothesis
- Accept the alternative hypothesis



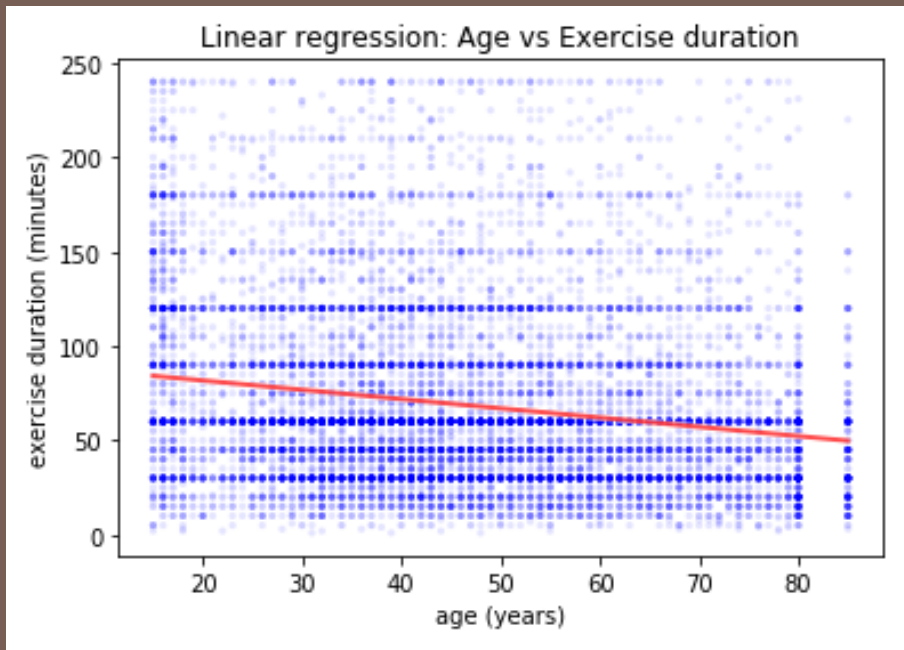


# Regression

Simple and multiple regression.

# Simple Regression

## Linear Least Squares:



## Exercise duration as a function of age:

r-squared: 0.036

p-value: 0.00

Age accounts for 3.6% of exercise duration in females.

# Simple Regression

## Exercise duration as a function of having a child:

r-squared: 0.009

Having a child accounts for 0.9% of exercise duration in females.

p-value: 0.00

This effect is likely to not occur by chance.

Dep. Variable:	tuactdur24	R-squared:	0.009			
Model:	OLS	Adj. R-squared:	0.009			
Method:	Least Squares	F-statistic:	126.0			
Date:	Sun, 23 Feb 2020	Prob (F-statistic):	4.04e-29			
Time:	12:19:13	Log-Likelihood:	-72090.			
No. Observations:	13700	AIC:	1.442e+05			
Df Residuals:	13698	BIC:	1.442e+05			
Df Model:	1					
Covariance Type:	nonrobust					
	coef	std err	t	P> t	[0.025	0.975]
Intercept	64.3629	0.543	118.456	0.000	63.298	65.428
haschild[T.True]	8.9805	0.800	11.227	0.000	7.413	10.548
Omnibus:	3193.379	Durbin-Watson:	1.997			
Prob(Omnibus):	0.000	Jarque-Bera (JB):	6469.184			
Skew:	1.396	Prob(JB):	0.00			
Kurtosis:	4.880	Cond. No.	2.54			

# Multiple Regression

## Exercise duration as a function of having a child and age:

r-squared: 0.036

r-squared increased to 3.6% accountability with adding age.

p-value has child: 0.146      p-value age: 0.00

The effect of age is likely to not occur by chance.

Having a child > .05 results not being statistically significant. This does not have an affect in determining exercise when age is involved.

Dep. Variable:	tuactdur24	R-squared:	0.036			
Model:	OLS	Adj. R-squared:	0.036			
Method:	Least Squares	F-statistic:	255.7			
Date:	Sun, 23 Feb 2020	Prob (F-statistic):	9.04e-110			
Time:	12:19:13	Log-Likelihood:	-71902.			
No. Observations:	13700	AIC:	1.438e+05			
Df Residuals:	13697	BIC:	1.438e+05			
Df Model:	2					
Covariance Type:	nonrobust					
	coef	std err	t	P> t	[0.025	0.975]
Intercept	93.2104	1.570	59.356	0.000	90.132	96.289
haschild[T.True]	-1.3818	0.951	-1.454	0.146	-3.245	0.482
teage	-0.5125	0.026	-19.543	0.000	-0.564	-0.461
Omnibus:	3183.238	Durbin-Watson:	1.999			
Prob(Omnibus):	0.000	Jarque-Bera (JB):	6532.242			
Skew:	1.382	Prob(JB):	0.00			
Kurtosis:	4.951	Cond. No.	222.			

# Multiple Regression

Exercise duration as a function of having children, age, hours work per week for self and for spouse:

r-squared: 0.041

r-squared increased to 4.1% accountability with adding hours work per week for self and spouse.

p-value has child: 0.479      p-value all others: 0.00

The effect of all others but having a child are likely to not occur by chance. Having a child has no affect on exercise duration with a p-value greater than 0.05.

Dep. Variable:	tuactdur24	R-squared:	0.041
Model:	OLS	Adj. R-squared:	0.040
Method:	Least Squares	F-statistic:	145.2
Date:	Sun, 23 Feb 2020	Prob (F-statistic):	8.94e-122
Time:	12:19:13	Log-Likelihood:	-71869.
No. Observations:	13700	AIC:	1.437e+05
Df Residuals:	13695	BIC:	1.438e+05
Df Model:	4		
Covariance Type:	nonrobust		

	coef	std err	t	P> t	[0.025	0.975]
Intercept	98.6877	1.737	56.819	0.000	95.283	102.092
haschild[T.True]	-0.7099	1.002	-0.708	0.479	-2.674	1.255
teage	-0.5578	0.027	-20.605	0.000	-0.611	-0.505
tehruslt	-0.1176	0.020	-6.028	0.000	-0.156	-0.079
tespuhrs	-0.0820	0.018	-4.586	0.000	-0.117	-0.047

Omnibus:	3163.839	Durbin-Watson:	1.997
Prob(Omnibus):	0.000	Jarque-Bera (JB):	6503.445
Skew:	1.372	Prob(JB):	0.00
Kurtosis:	4.967	Cond. No.	268.

# Conclusion

Through comparison of CDF, hypothesis testing, and simple regression, women's exercise habits are different with those that have children under the age of 18 and those that do not. Those with children exercise less than those that do not have children. However, when looking at multiple regression, other variables account for female exercise habits that do not involve having children.

# Resources

DeJesus, John. (2019). What, Why, and How to Read Empirical CDF. *Towards Data Science*. Retrieved from <https://towardsdatascience.com/what-why-and-how-to-read-empirical-cdf-123e2b922480>

Downey, A. B. (2015). *Think Stats: Exploratory Data Analysis* (2<sup>nd</sup> ed.). Sebastopol, CA: O'Reilly Media Inc.

Minitab Blog Editor. (2013). How to Interpret Regression Analysis Results: P-values and Coefficients. Retrieved from <https://blog.minitab.com/blog/adventures-in-statistics-2/how-to-interpret-regression-analysis-results-p-values-and-coefficients>

Pathak, Manish. (2018). Joining DataFrames in Pandas. *DataCamp*. Retrieved from <https://www.datacamp.com/community/tutorials/joining-dataframes-pandas>

U.S. Bureau of Labor Statistics. (2017). American Time Use Survey: Multi-Year Survey Microdata Files from 2003-2015. Retrieved from <https://www.kaggle.com/bls/american-time-use-survey/data>

VanderPlas, J. (2016). *Python Data Science Handbook: Essential tools for Working with Data* (1<sup>st</sup> ed.). O'Reilly Media Inc.