



# ANOVA



**(Between Groups/Subjects)**

**Analysis**

**of**

**Variance**

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# What is ANOVA?

- ***Like T test, compares the means of populations/groups***
- ***Unlike T Test, ANOVA can compare two or more populations/groups***
- ***ANOVA is part of family of F-tests, and compares means relative to variation within groups***

# Assumptions for ANOVA



- Normal data distribution
- Interval Data
- Levine's test P value .035



- Normal data distribution
- Ordinal Data
- Levine's test P value .564



- Abnormal data distribution
- Ratio Data
- Levine's test P value .342



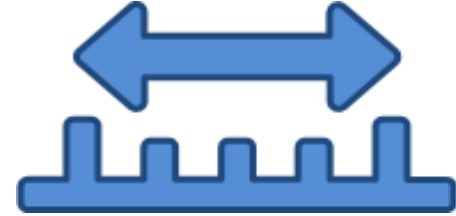
- Normal data distribution
- Interval Data
- Levine's test P value .254

# Assumptions for ANOVA



- Normal data distribution
- Interval Data
- Levine's test P value .254

• **Interval or Ratio Data**



• **Data must be NORMAL**







• **Homogenous Variance**



# ONE-WAY ANOVA

**“A one-way ANOVA is used when we have 1 IV with >3 levels, independent samples, and the same DV” -Miguel**

# ONE-WAY ANOVA

	 1	 2	 3	 4
Participant Test Scores (%)	72	86	72	76
	52	69	94	86
	94	71	65	69
	71	92	85	74
	82	71	73	94





## Participant Groups

- **No Exercise**
- **Walking**
- **Running**
- **Cycling**

***Study testing the effect of different forms of morning exercise on cognitive function (Measured using standardized problem-solving quiz)***

# ONE-WAY ANOVA

**4 GROUPS TOTAL**

				
Participant Test Scores (%)	72	86	72	76
	52	69	94	86
	94	71	65	69
	71	92	85	74
	82	71	73	94



***More than 2 groups, T-Test CANNOT be used.***

# HYPOTHOSES: ANOVA VS T-TEST

$H^0$  for T-Test

$$\mu^1 = \mu^2$$

$H^1$  for T-Test

$$\mu^1 \neq \mu^2$$

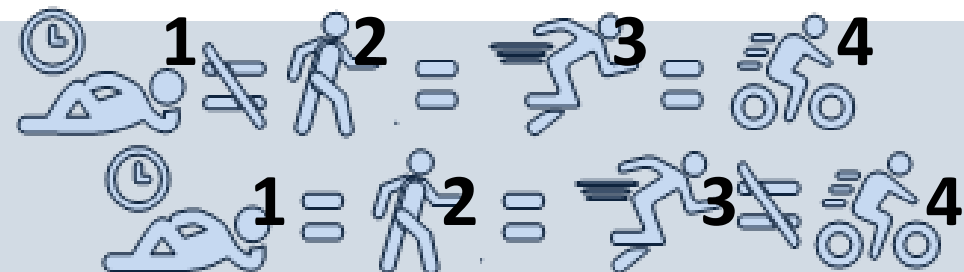
$H^0$  One-Way ANOVA

$$\mu_1 = \mu_2 = \mu_3 = \mu_4$$



$H^1$  One-Way ANOVA

$$\mu^* \neq \mu^* \quad (* = \text{any})$$





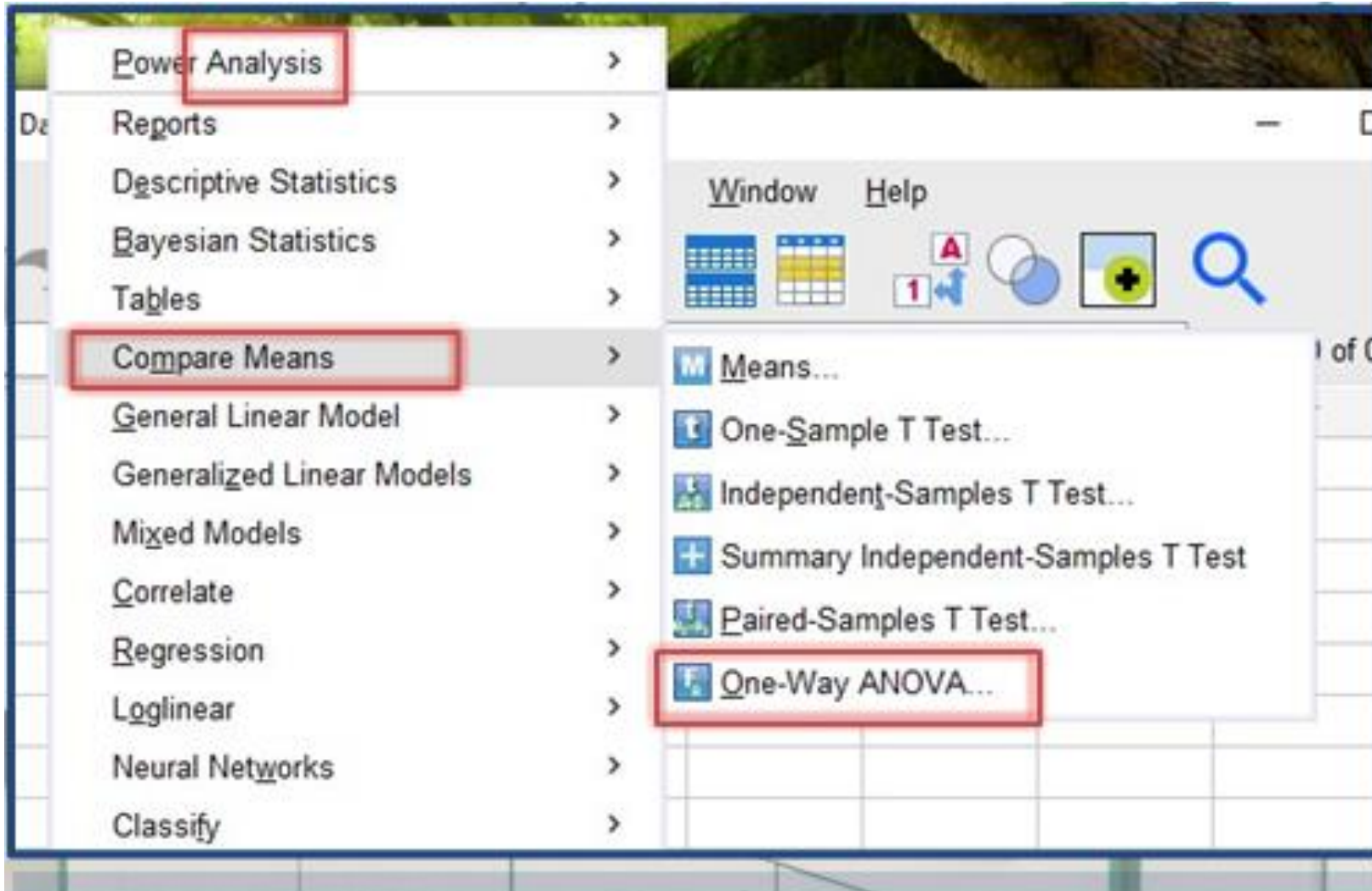
# WARNING ABOUT ANOVA

**IMPORTANT! The ONE-WAY ANOVA is not intended to give details about bilateral relationships between groups.**



**It simply presents a boolean True/False value relating to the ANOVA null hypothesis.**

# Accessing One-Way ANOVA in SPSS







\*\*Ensure data normality



\*\*Deal with outliers

\*\*Ensure data is interval or ratio

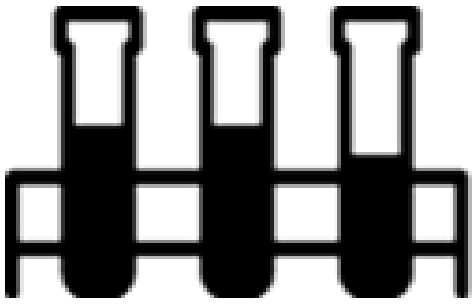
**\*\*Run any preliminary analyses needed first**

# When to use TWO-WAY ANOVA

	 1	 2	 3	 4
10AM Test Scores (%)	72	86	72	76
	52	69	94	86
	86	73	69	73
4PM Test Scores (%)	94	71	65	69
	71	92	85	74

 **NEW IV: TEST TIME** 

***In an expanded version of the study, time of day that the test is taken is also a factor. One-Way ANOVA cannot be used.***



## ***TWO-WAY ANOVA***



***A TWO-WAY ANOVA tests the effect of multiple groups of two independent variables on a dependent variable and on each other.***

***The two independent variables in a TWO-WAY ANOVA are called FACTORS. Each factor will have two or more levels within it.***





# ***TREATMENT GROUPS***



***Treatment groups are formed by making all possible combinations of two factors.***





***For example, if the first factor has 3 levels and the second factor has 2 levels, then there will be  $3 \times 2 = 6$  different treatment groups.***



# ANOVA



***As a follow-up study, Lorraine wants to test the effect of the time of the day of the test in addition to the type of exercises performed (TWO-WAY ANOVA).***

		<b>IV: TIME OF THE DAY</b>			
					
Scores	Test	72	86	72	76
	10 AM	52	69	94	86
		86	73	69	73
Scores	Test	94	71	65	69
	4 PM	71	92	85	74
		82	71	73	94

• **First factor: Type of exercise assigned to the participants; levels: none, walking, running, cycling (4 levels)**

• **Second factor: Time of the day of the test; levels: 10:00 AM and 4:00 PM (2 levels)**

• **Hence, Lorraine will have  $4 \times 2 = 8$  different treatment groups**



	None	Walking	Running	Cycling
10:00 AM	65	86	72	80
	74	69	94	94
	90	82	65	87
	71	92	85	74
	82	83	73	86
	86	80	90	92
4:00 PM	77	80	90	76
	66	72	85	86
	72	71	73	73
	80	92	60	74
	68	63	68	94



# ***MAIN EFFECT AND INTERACTION***



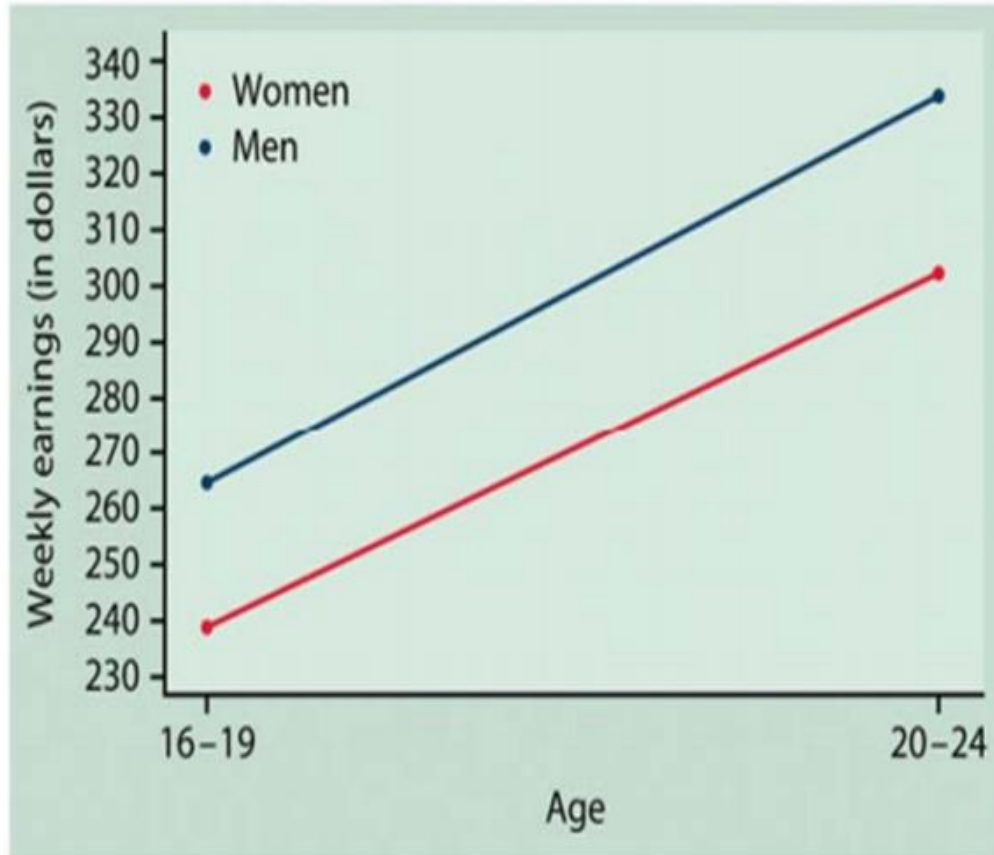
***Main effect is the direct effect of a single factor or independent variable on the dependent variable.***

***Interaction effect is the combined effect of two or more factors on the dependent variable.***





## ***Interpreting Main Effects and Interactions Plots***

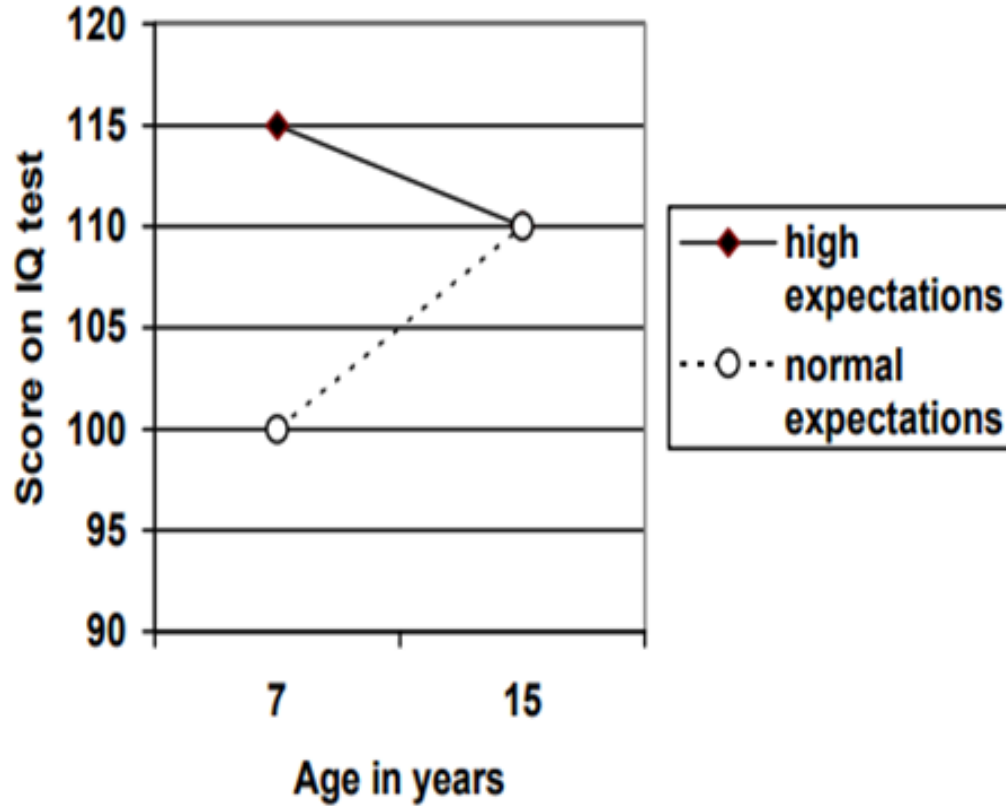


***There are only two main effects that are present: an effect due to age and gender.***

***Parallel lines in plot usually indicate little or no interaction.***



## ***Interpreting Main Effects and Interactions through Figures***

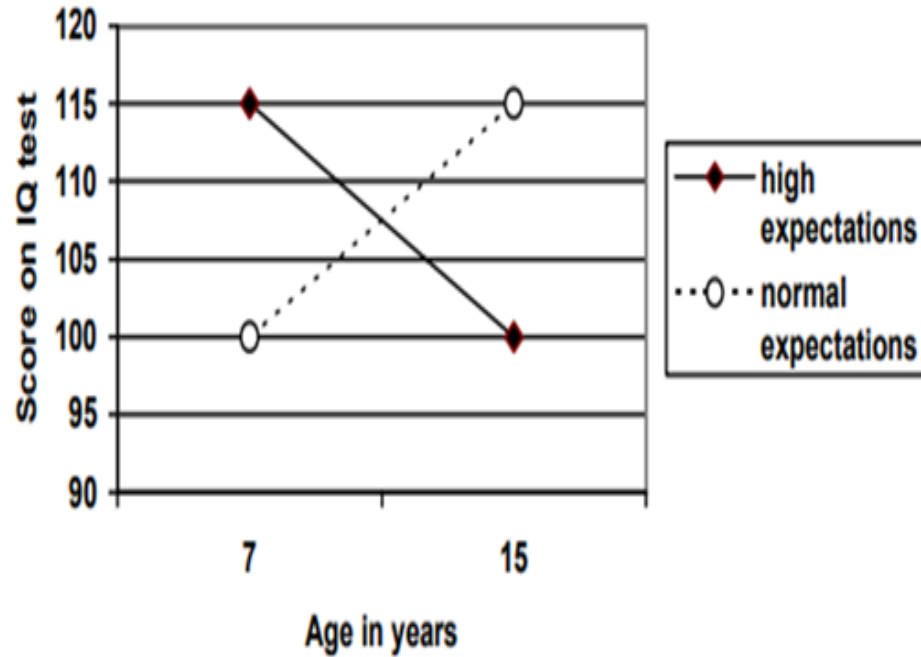


***The less parallel the lines are, the more likely there is to be a significant interaction. So, in this case, we would expect an interaction.***

***Effects of age and teacher expectations on IQ scores***



## ***Interpreting Main Effects and Interactions through Figures***



***The lines are not parallel, so there is likely to be an interaction. Because the lines intersect, this type of interaction is sometimes called a cross-over interaction.***

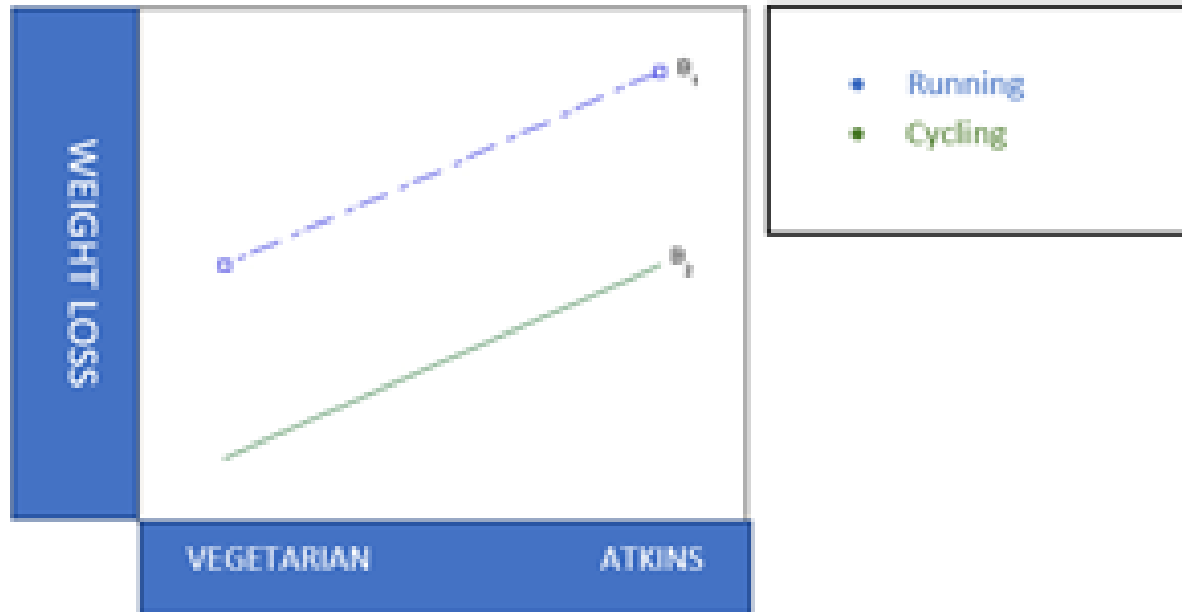
***A cross-over interaction***

# Interpret the Following Plots: Main Effects and Interaction



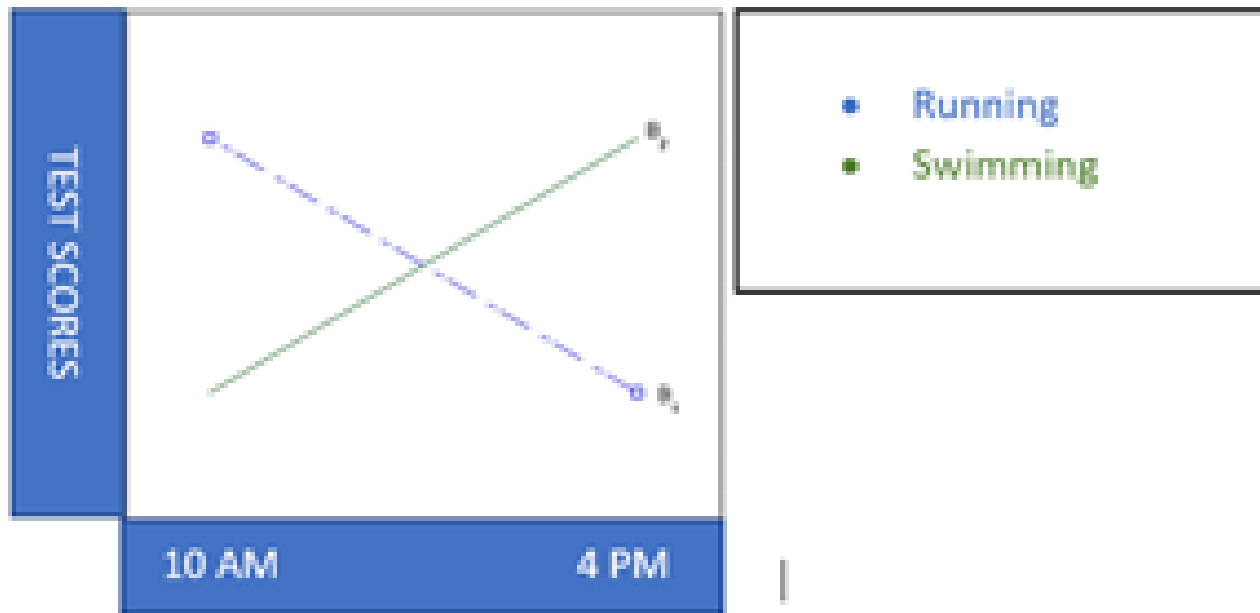
- A) Main Effect Factor Gender
- B) Main Effect Factor Season
- C) Interaction of Both Factors

# Interpret the Following Plots: Main Effects and Interaction

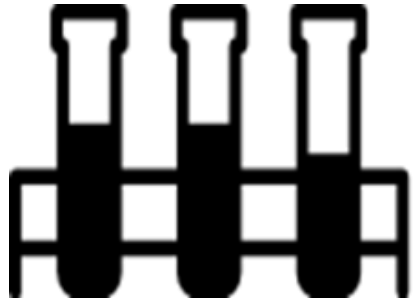


- A) Main Effect Factor Diet
- B) Main Effect Factor Exercise
- C) Interaction of Both Factors

# Interpret the Following Plots: Main Effects and Interaction



- A) Main Effect Factor Time
- B) Main Effect Factor Exercise
- C) Interaction of Both Factors



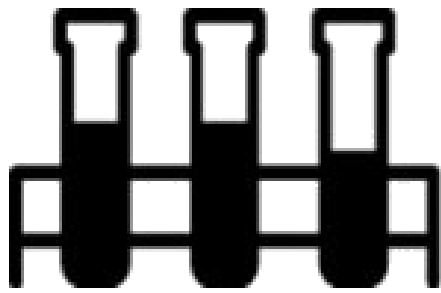
## ***TWO-WAY ANOVA: ASSUMPTIONS CHECKLIST***



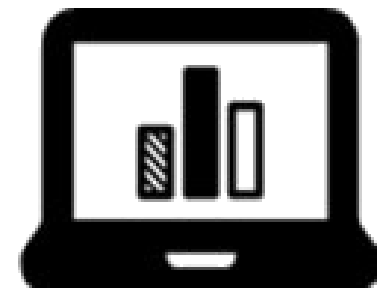
**•Assumption #1:** *Your dependent variable should be measured at the continuous level (i.e., they are interval or ratio variables).*

**•Assumption #2:** *Your two independent variables should each consist of two or more categorical, independent groups*

**•Assumption #3:** *You should have independence of observations*



## ***TWO-WAY ANOVA: ASSUMPTIONS CHECKLIST***

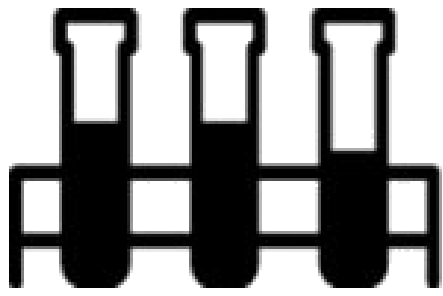


**•Assumption #4:** *There should be no significant outliers.*

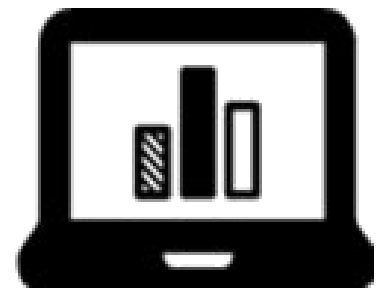
**•Assumption #5:**  
*Your dependent variable should be approximately normally distributed for each combination of the groups of the two independent variables*

**•Assumption #6:**  
*There needs to be homogeneity of variances for each combination of the groups of the two independent variables.*

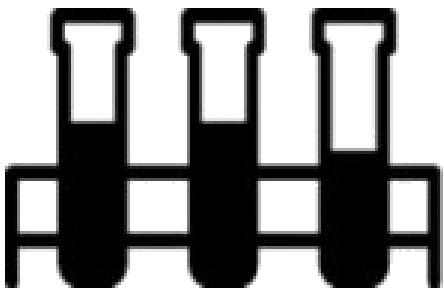




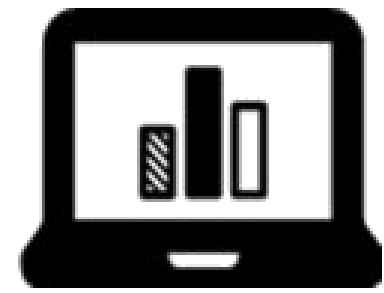
# ***HYPOTHESES***



- ***Ho1: The sample means of the first factor are equal.***
- ***Ho2: The sample means of the second factor are equal.***
- ***Ho3: There is no interaction between the two factors.***

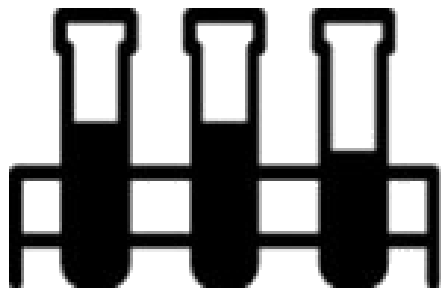


## ***TWO-WAY ANOVA IN SPSS***

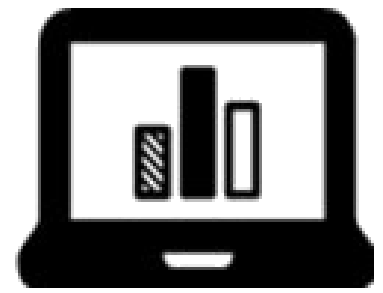


***Lorraine wants to conduct a research study to see if the individual's weight is affected by the type of the diet and the type of the exercise.***

***In order to find out, 180 participants were randomly assigned to one of the three types of diet (None, Vegetarian and Atkins) and three types of exercises (None, 30 min a day and 60 min. a day)***



# ***HYPOTHESES***



***H0= The means of all diet groups are equal***

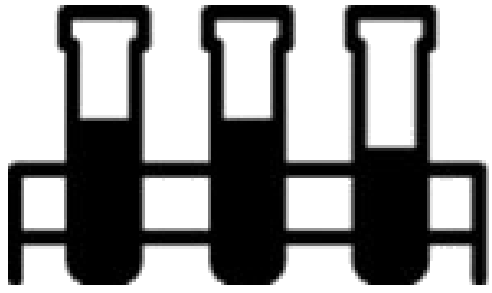
***H1=The mean of at least one diet group is different.***

***H0= The means of the exercise groups are equal***

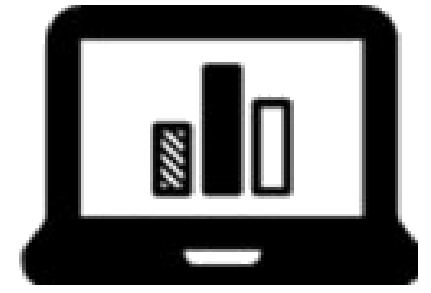
***H1=The means of the exercise groups are different.***

***H0= There is no interaction between the diet and exercise***

***H1=There is an interaction between the diet and exercise***



# ***TREATMENT GROUPS***



• ***First factor: Type of the exercise assigned to the participants; levels: none, 30 min a day, 60 min a day (3 levels)***

• ***Second factor: Type of the diet assigned to the participants; levels: None, Vegetarian and Atkins (3 levels)***

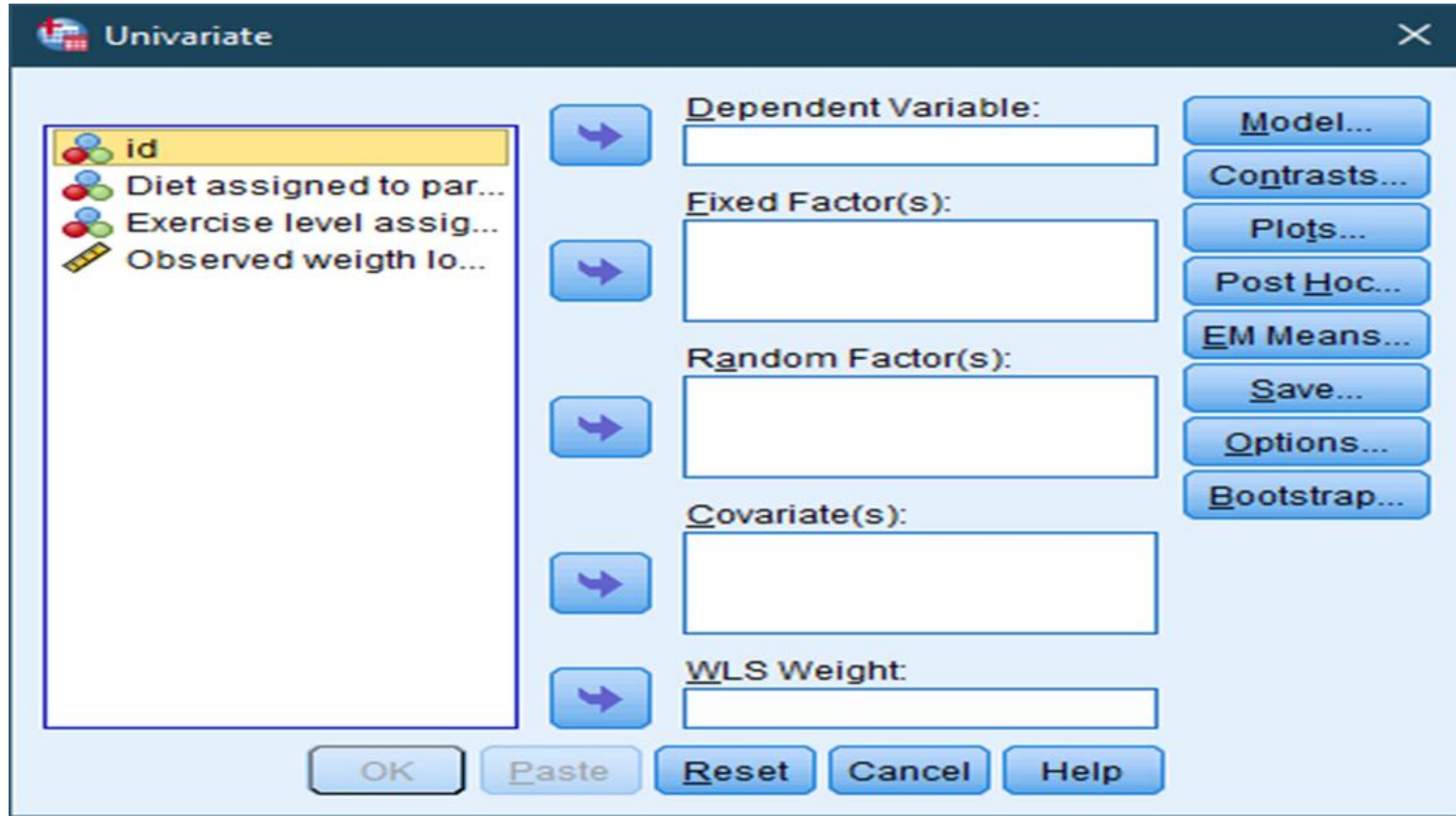
• ***Hence, Lorraine will have  $3 \times 3 = 9$  different treatment groups***

	None	Vegetarian	Atkins
None	20	20	20
30 min a day	20	20	20
60 min a day	20	20	20

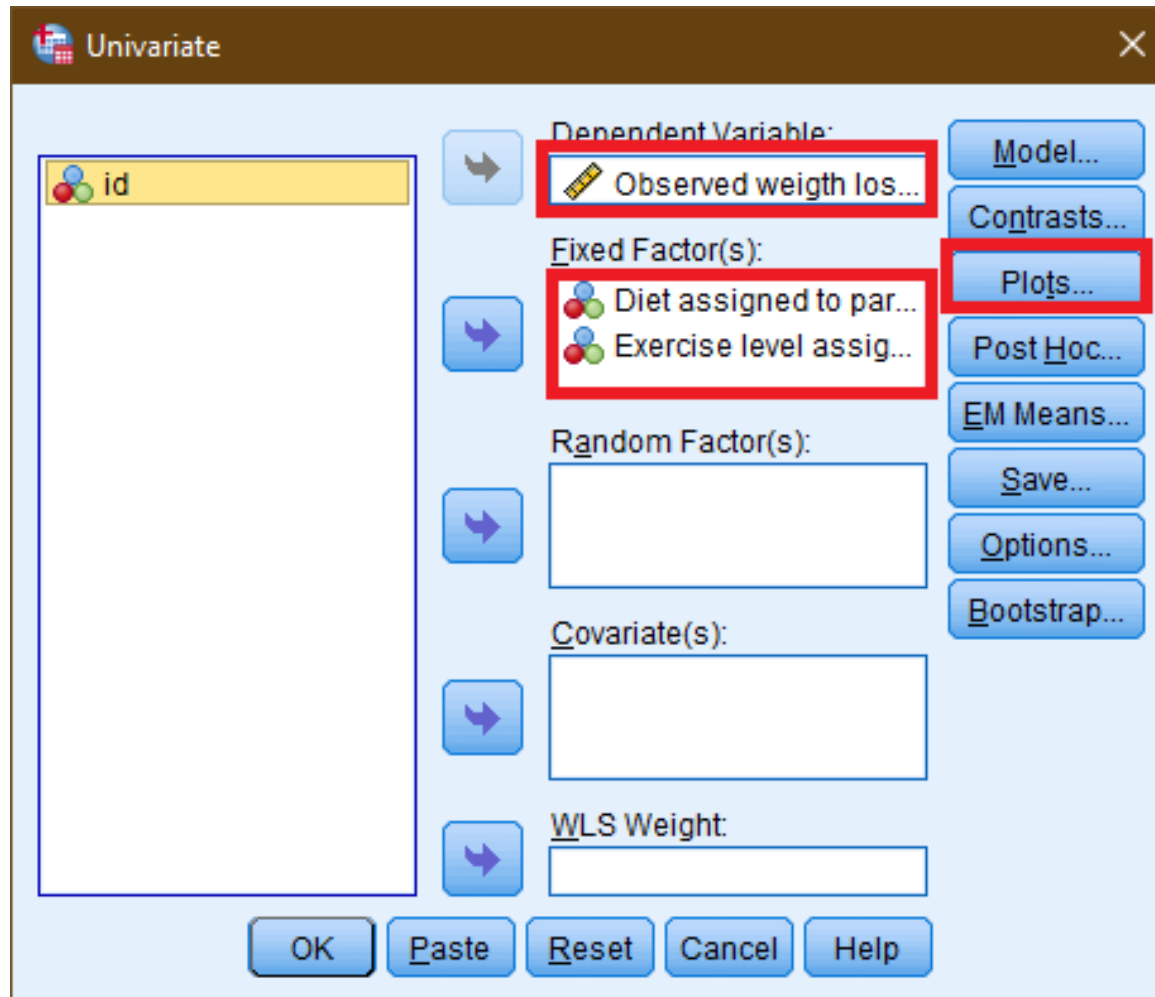
# 1. Analyze >> General Linear Model >> Univariate...

The screenshot shows the IBM SPSS Statistics Data Editor interface. The 'Analyze' menu is open, and the 'General Linear Model' option is selected, which has opened a sub-menu where 'Univariate...' is highlighted. The background shows a data grid with columns 'id' and 'diet', and rows numbered 1 through 24. The status bar at the bottom indicates 'Univariate...' and 'IBM SPSS Statistics Processor is ready'.

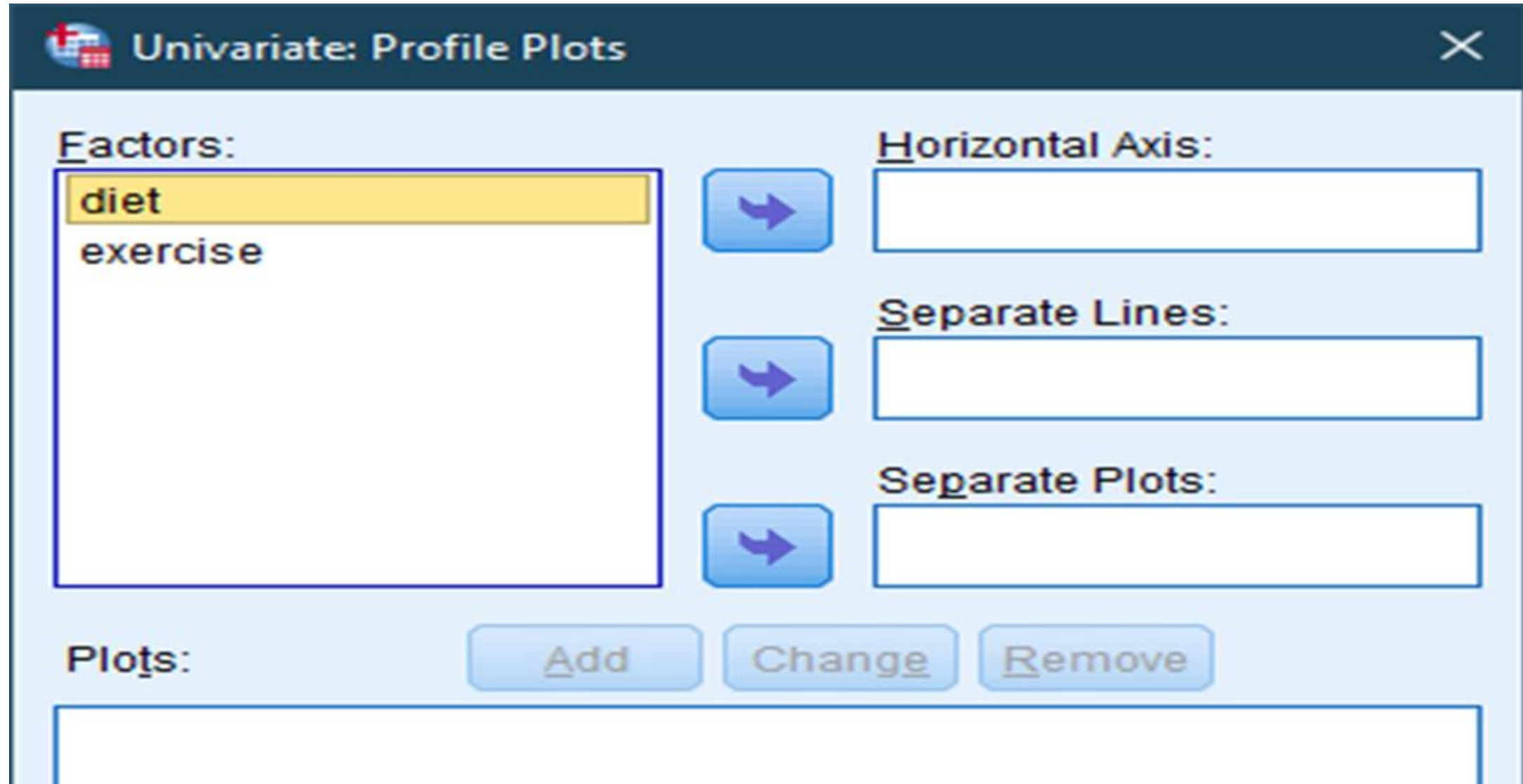
**2. You will be presented with the "UNIVARIATE", as shown below:**



**3. Add “Weight loss” into the “Dependent Variable” and Diet and Exercise into the “Fixed Factor(s)”. After click on Plots**



**4. You'll be presented with the "Univariate: Profile Plots" window, as shown below:**





**5. Transfer "Diet" and "Exercise" to the "Horizontal Axis" and "Separate lines". Click on "Continue" and then you'll be returned to the Univariate dialogue box.**

The image shows the 'Univariate: Profile Plots' dialog box. The 'Factors' list on the left contains 'diet' and 'exercise'. The 'Horizontal Axis' field contains 'exercise', and the 'Separate Lines' field contains 'diet'. The 'Add' button in the 'Plots' section is highlighted with a red box. The 'Continue' button at the bottom is also highlighted with a red box.

**Univariate: Profile Plots**

**Factors:**

- diet
- exercise

**Horizontal Axis:**

exercise

**Separate Lines:**

diet

**Separate Plots:**

**Plots:** Add Change Remove

**Chart Type:**

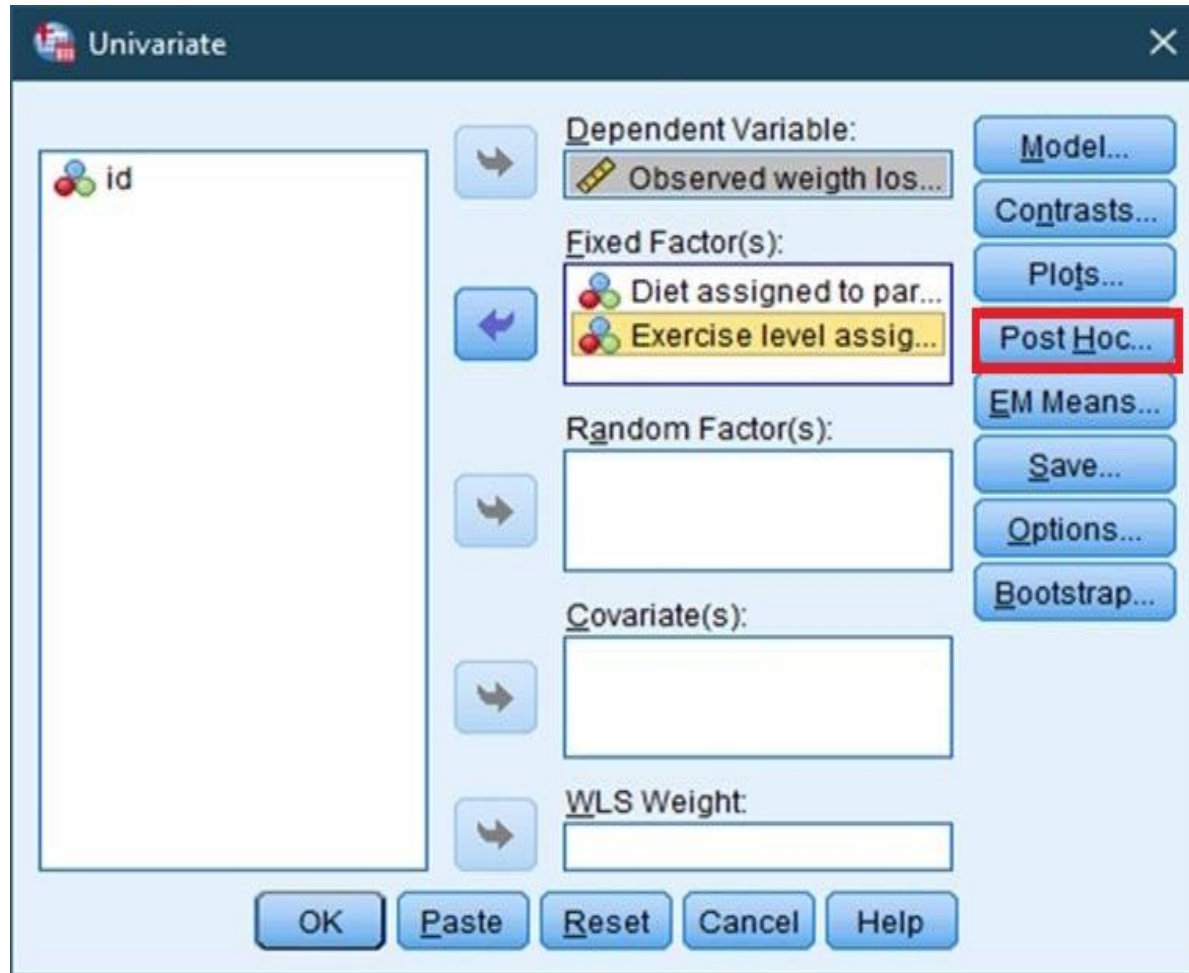
- Line Chart
- Bar Chart

**Error Bars**

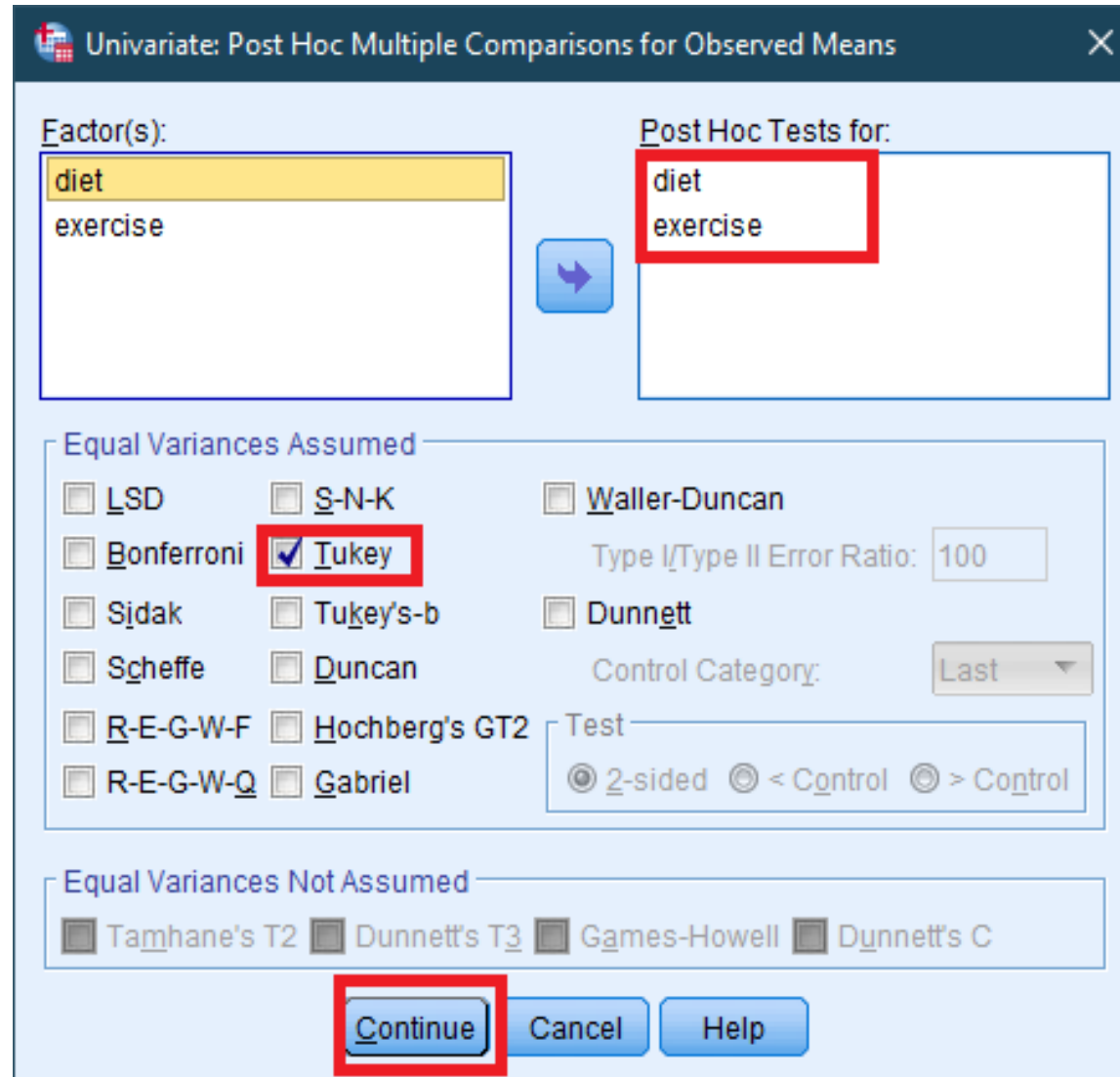
- Include Error bars
  - Confidence Interval (95.0%)
  - Standard Error Multiplier: 2
- Include reference line for grand mean
- Y axis starts at 0

**Continue** **Cancel** **Help**

## 6. Click on "Post Hoc"



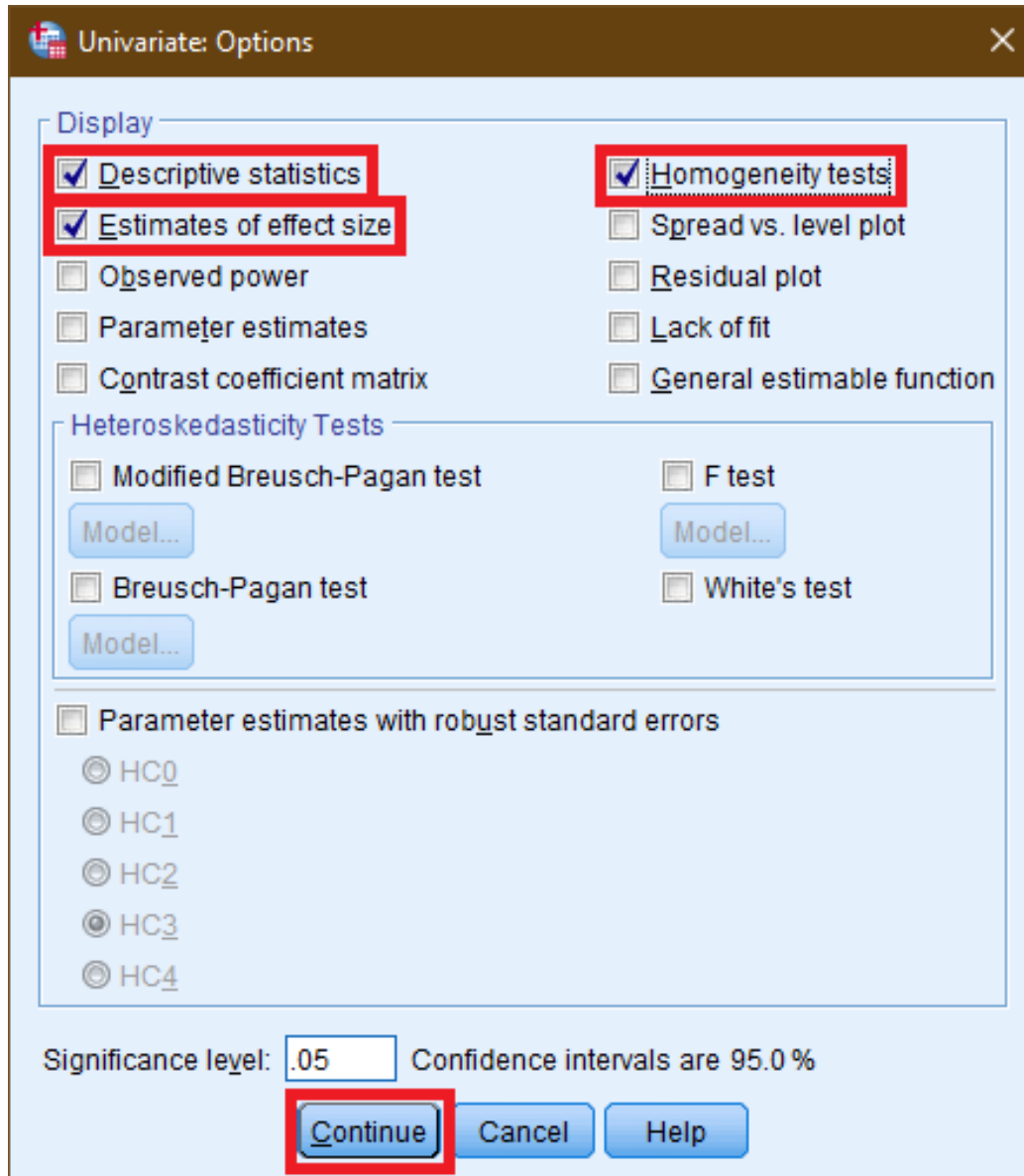
**7. Transfer the factors to the "Post Hoc Tests for", after check "Tukey" >>Continue, which will bring you back to "Univariate" window**



## 8. Click on the "Options"

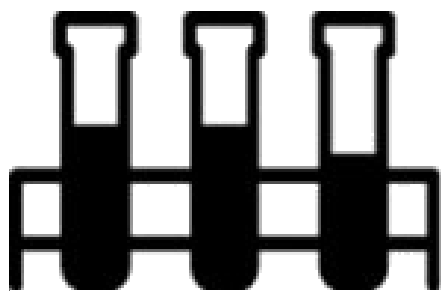


**9. “Options” >> “Descriptive Statistics” >> “Estimates of effect size” >> “Homogeneity tests” >> Continue>>OK**

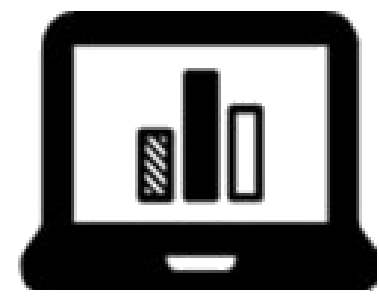


**10. You will be back to "Univariate" window again. Click "OK" to run the analysis.**





# TESTS OF BETWEEN SUBJECT EFFECTS



## Tests of Between-Subjects Effects

Dependent Variable: Observed weight loss in kilos over last 2 months

Source	Type III Sum of Squares	df	Mean Square	F	Sig.
Corrected Model	1905.037 <sup>a</sup>	8	238.130	27.647	.000
Intercept	3624.868	1	3624.868	420.844	.000
diet	363.904	2	181.952	21.124	.000
exercise	1508.859	2	754.429	87.589	.000
diet * exercise	32.274	4	8.069	.937	.444
Error	1472.879	171	8.613		
Total	7002.784	180			
Corrected Total	3377.916	179			

a. R Squared = .564 (Adjusted R Squared = .544)



## Main Effects for Diet

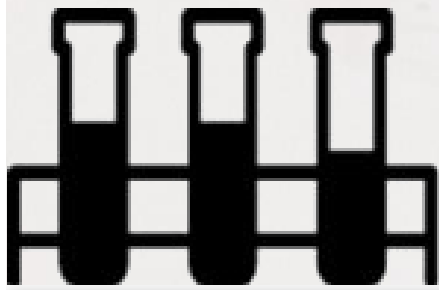
$$F(2, 171) = 21.124, p = .000$$

## Main effects for Exercise

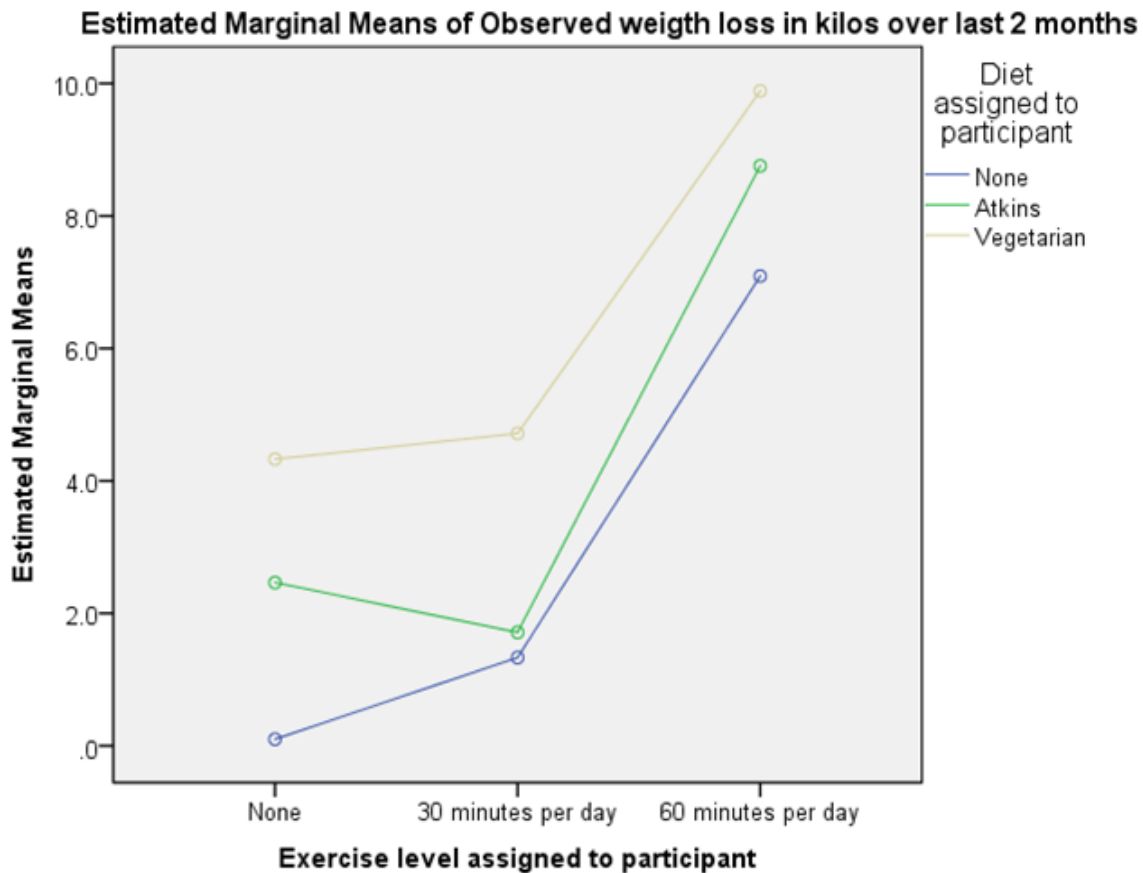
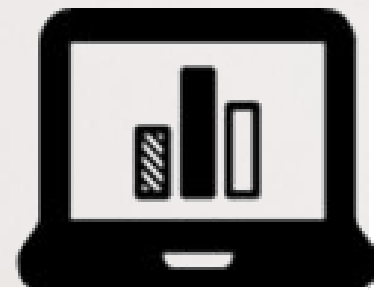
$$F(2, 171) = 87.589, p = .000$$

## No interaction between diet and exercise

$$F(4, 171) = .937, p = .444$$



## TWO-WAY ANOVA OUTPUT:



Each line rises steeply between 30 to 60 minutes of exercise per day.

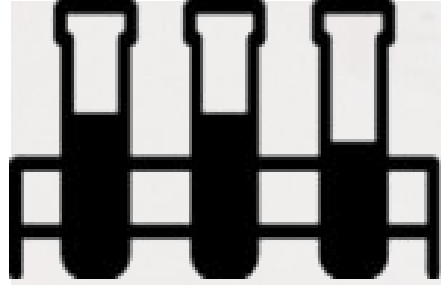
A vegetarian diet resulted in more weight loss than the other diets.

Both diet and exercise seem to have a **main effect** on weight loss.

Since these lines look pretty similar, the plot doesn't show much of an interaction effect.

Retrieved from <https://www.spss-tutorials.com/spss-two-way-anova-basics-tutorial/>





# MULTIPLE COMPARISONS



## Multiple Comparisons

Dependent Variable: Observed weight loss in kilos over last 2 months

Tukey HSD

(I) Exercise level assigned to participant	(J) Exercise level assigned to participant	Mean Difference (I-J)	Std. Error	Sig.	95% Confidence Interval	
					Lower Bound	Upper Bound
None	30 minutes per day	-.289	.5358	.852	-1.556	.978
	60 minutes per day	-6.281*	.5358	.000	-7.548	-5.014
30 minutes per day	None	.289	.5358	.852	-.978	1.556
	60 minutes per day	-5.992*	.5358	.000	-7.259	-4.725
60 minutes per day	None	6.281*	.5358	.000	5.014	7.548
	30 minutes per day	5.992*	.5358	.000	4.725	7.259

Based on observed means.

The error term is Mean Square(Error) = 8.613.

\*. The mean difference is significant at the 0.05 level.



The difference in weight loss between no exercise and 30 minutes is 0.29 kg.

The difference between no exercise and 60 min exercise is very big, about 6.28 kg. Also, p value shows that the difference is statistically significant.

# References

Two-way ANOVA in SPSS Statistics. (n.d.). Retrieved December 12, 2020, from <https://statistics.laerd.com/spss-tutorials/two-way-anova-using-spss-statistics.php>

ANOVA Test: Definition, Types, Examples. (2020, September 17). Retrieved December 12, 2020, from <https://www.statisticshowto.com/probability-and-statistics/hypothesis-testing/anova/>

MacKenzie, R. (2018, July 23). One-Way vs Two-Way ANOVA: Differences, Assumptions and Hypotheses. Retrieved December 12, 2020, from <https://www.technologynetworks.com/informatics/articles/one-way-vs-two-way-anova-definition-differences-assumptions-and-hypotheses-306553>

SPSS Two Way ANOVA – Basics Tutorial. (n.d.). Retrieved December 12, 2020, from <https://www.spss-tutorials.com/spss-two-way-anova-basics-tutorial/>

Musadoto Follow. (2017, November 16). 2 way ANOVA(Analysis Of VAriance. Retrieved December 12, 2020, from [https://www2.slideshare.net/musadoto/2-way-anovaanalysis-of-variance?from\\_action=save](https://www2.slideshare.net/musadoto/2-way-anovaanalysis-of-variance?from_action=save)

**For a study testing three different fertilizers and their effects on the same type of plant, which test would be used to compare the means of the three groups?**



T-TEST



ONE-WAY  
ANOVA



TWO-WAY  
ANOVA

**Which test would you use for a study testing average running speed of people wearing two different types of shoes?**



T-TEST



ONE-WAY  
ANOVA



TWO-WAY  
ANOVA

**Which test would you use for a study testing the effect of yoga and tai chi on the blood pressure depending on the time of the day?**



T-TEST



ONE-WAY  
ANOVA



TWO-WAY  
ANOVA