



Interpreting (Even Tricky) Regression Coefficients

Dummy Coding Binary Predictors: Main Effects and Interactions

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Dummy Coding Binary Predictors: Main Effects and Interactions

1. The Basic Difference Between Dummy and Effect Coding
2. Dummy Coding Binary Variables
3. Interactions Between a Dummy-Coded Binary and a Numerical Predictor
4. Interpreting Coefficients with an Interaction: Binary Predictor is Key Variable
5. Interpreting Coefficients with an Interaction: Numerical Predictor is Key Variable



The Basic Difference Between Dummy and Effect Coding

Dummy and Effect Coding



$$E(Y|X) = \beta_0 + \beta_1 X$$

How do we code categories of X?

Dummy and Effect Coding



$$E(Y|X) = \beta_0 + \beta_1 X$$

Effect Coding

$X = 1$ for first group

$X = -1$ for second group

Dummy Coding

$X = 1$ for comparison group

$X = 0$ for reference group

Dummy and Effect Coding



Effect Coding:

Compare group means to the Grand Mean

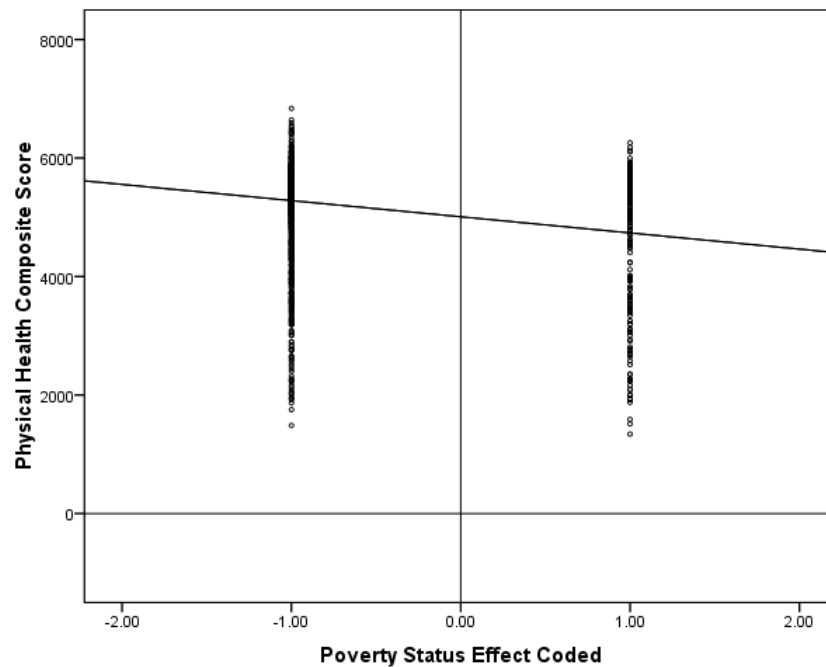
Dummy Coding:

Compare other group means to the mean of one group (reference, base group)

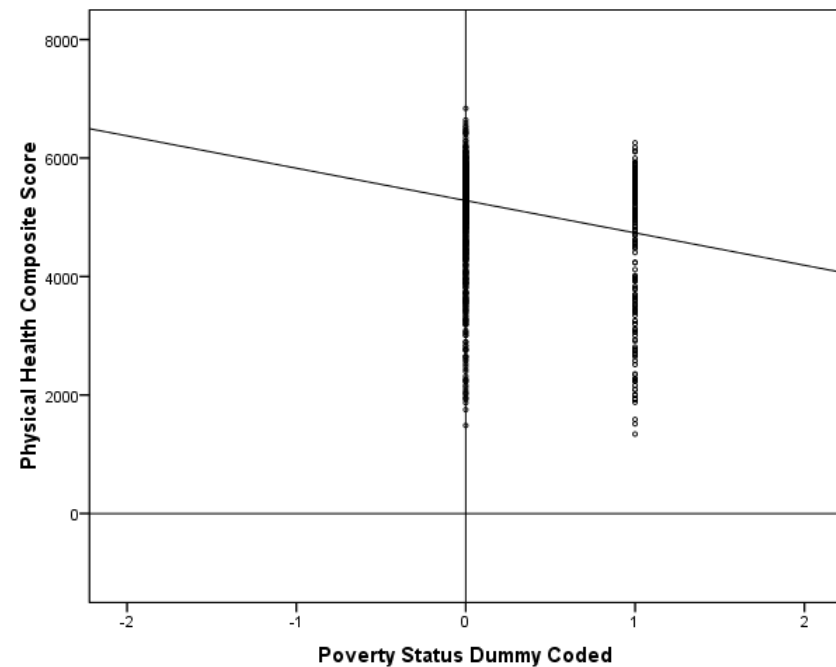


Dummy and Effect Coding

Effect Coding



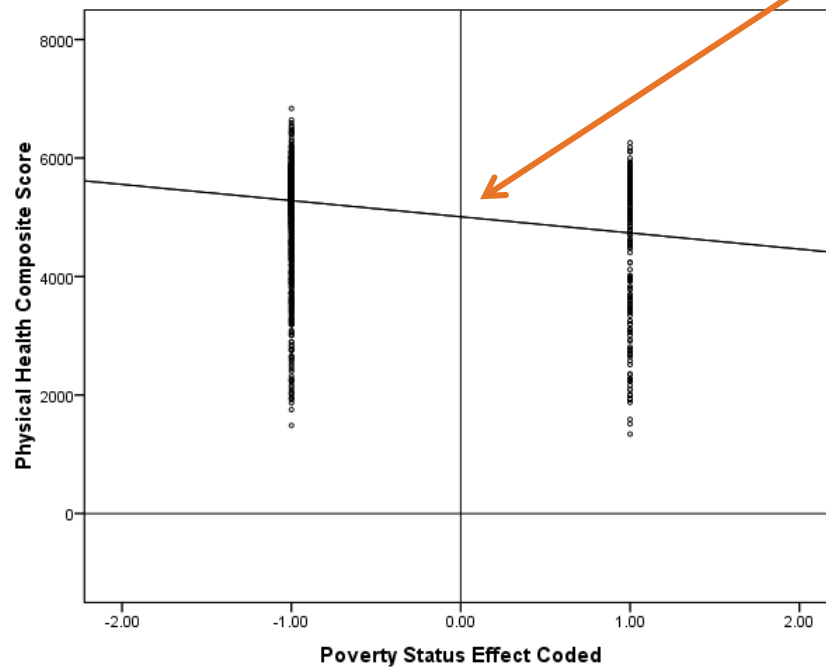
Dummy Coding





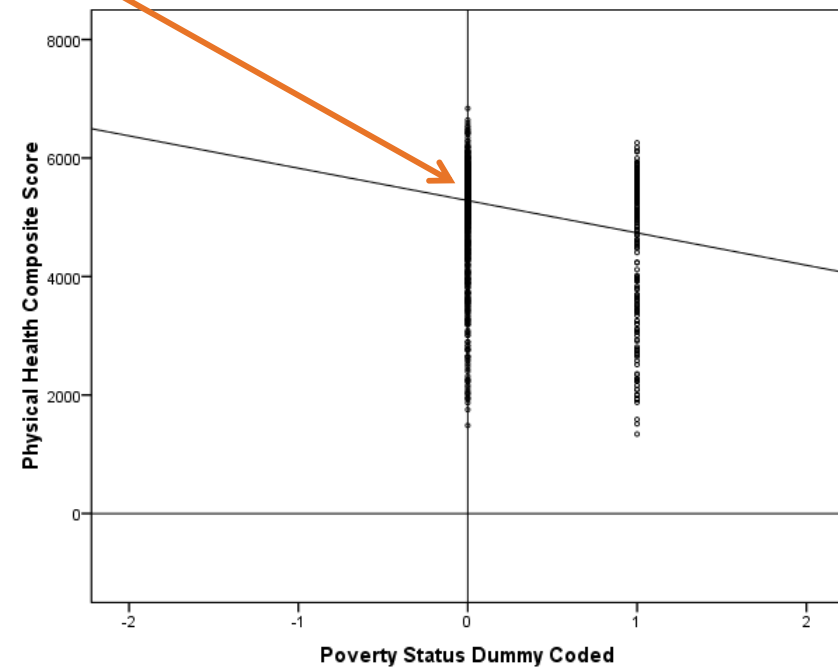
Dummy and Effect Coding

Effect Coding



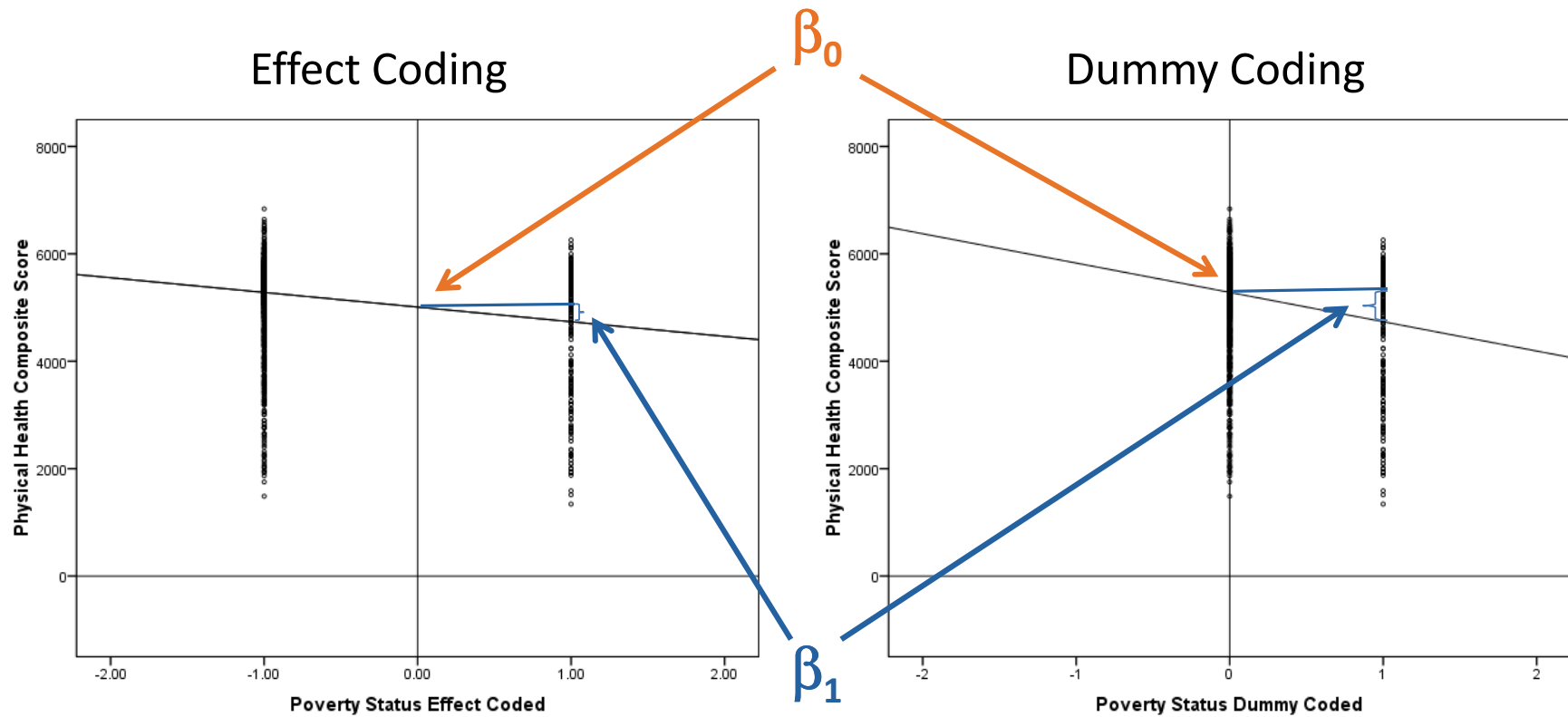
β_0

Dummy Coding





Dummy and Effect Coding





Dummy Coding Binary Variables

Dummy Coding Binary Variables



	Original Code	Value Label	Dummy Code	N
Poverty Status	2.00	Poverty	1	266
	3.00	Not in Poverty	0	1434

Dummy Coding Binary Variables



One binary predictor: Poverty Status

ANOVA

Dependent Variable: PCS

Source	Type III Sum of Squares	df	Mean Square	F	p
Model	66877513.406 ^a	1	66877513.406	102.343	.000
Poverty Status	66877513.406	1	66877513.406	102.343	.000
Error	1109582872.150	1698	653464.589		
Total	1176460385.555	1699			



Dummy Coding Binary Variables

One binary predictor: Poverty Status

Marginal Means

Dependent Variable: PCS

Poverty Status	Mean	se
Poverty	4736.812	49.564
Not in Poverty	5282.757	21.347

Pairwise Comparisons

Dependent Variable: PCS

Comparison	Mean Difference	se	p
In Poverty - Not in Poverty	-545.945*	53.966	.000

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5282.757	21.347	247.471	.000
Poverty	-545.945	53.966	-10.116	.000
Not In Poverty	0 ^a	.	.	.

a. This parameter is set to zero because it is redundant.



Dummy Coding Binary Variables

One binary predictor: Poverty Status

Marginal Means

Dependent Variable: PCS

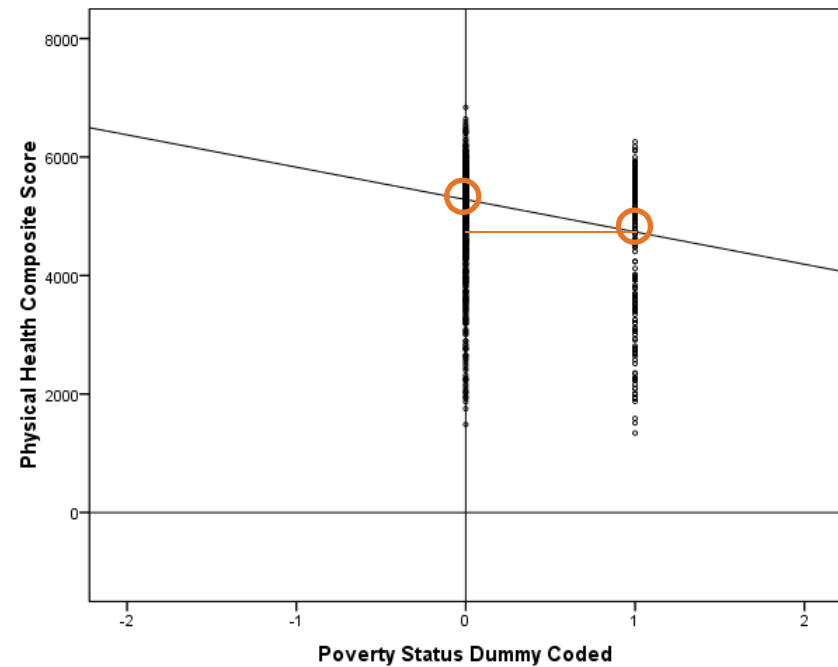
Poverty Status	Mean	se
Poverty	4736.812	49.564
Not in Poverty	5282.757	21.347

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5282.757	21.347	247.471	.000
Poverty	-545.945	53.966	-10.116	.000
Not In Poverty	0 ^a	.	.	.

a. This parameter is set to zero because it is redundant.





Dummy Coding Binary Variables

One binary predictor: Poverty Status

One continuous predictor: Depression

ANOVA

Dependent Variable: PCS

Source	Type III Sum of Squares	df	Mean Square	F	p
Model	162260943.378 ^a	2	81130471.689	135.751	.000
Poverty Status	25730163.034	1	25730163.034	43.053	.000
Depression Centered	95383429.973	1	95383429.973	159.599	.000
Error	1014199442.177	1697	597642.571		
Total	1176460385.555	1699			

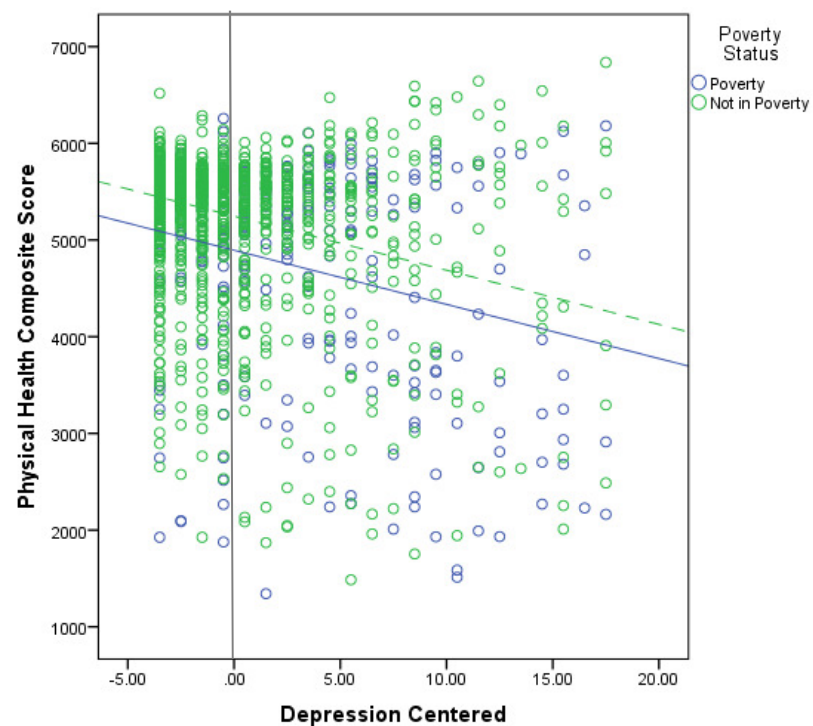
Dummy Coding Binary Variables



Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5247.448	20.605	254.665	.000
Poverty	-353.131	53.819	-6.561	.000
Not In Poverty	0	.	.	.
Depression Centered	-56.011	4.434	-12.633	.000





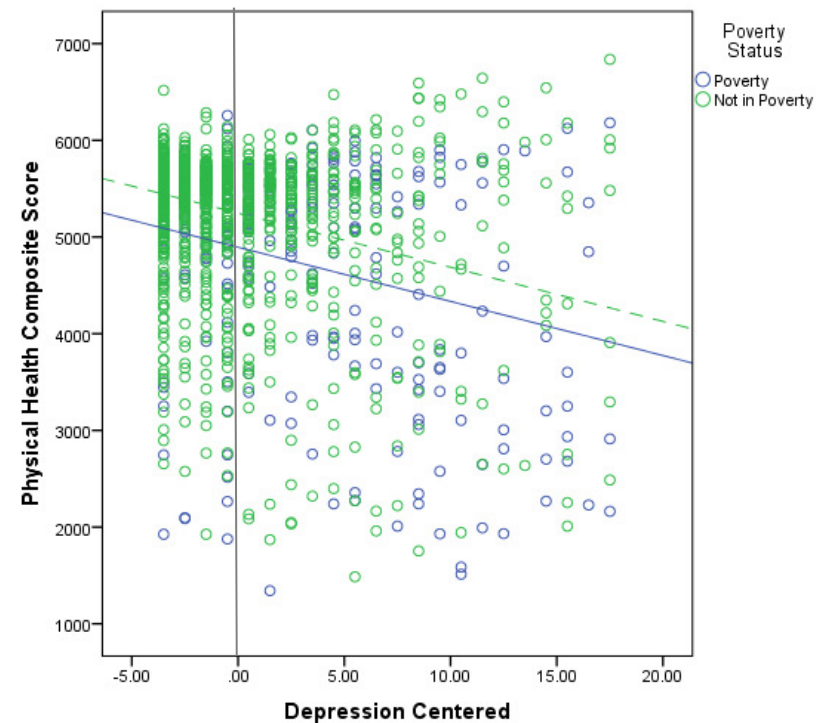
Dummy Coding Binary Variables

Why two parallel regression lines from this table?

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5247.448	20.605	254.665	.000
Poverty	-353.131	53.819	-6.561	.000
Not In Poverty	0	.	.	.
Depression Centered	-56.011	4.434	-12.633	.000





Dummy Coding Binary Variables

$$E(\text{PHC} | X) = 5247 - 353 * \text{Poverty} - 56 * \text{Depression}$$

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5247.448	20.605	254.665	.000
Poverty	-353.131	53.819	-6.561	.000
Not In Poverty	0	.	.	.
Depression Centered	-56.011	4.434	-12.633	.000

Poverty has two Values

1 = In Poverty

0 = Not In Poverty



Dummy Coding Binary Variables

$$E(\text{PHC} | X) = 5247 - 353 * \text{Poverty} - 56 * \text{Depression}$$

Regression Coefficients

Dependent Variable: PCS

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Intercept	5247.448	20.605	254.665	.000
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Not in Poverty Group (Reference):

Poverty = 0



Dummy Coding Binary Variables

$$E(\text{PHC} | X) = 5247 - 353 * \text{Poverty} - 56 * \text{Depression}$$

Regression Coefficients

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Not in Poverty Group (Reference):

Poverty = 0

$$\begin{aligned} E(\text{PHC} | X) &= 5247 - 353 * 0 - 56 * \text{Depression} \\ &= 5247 - 56 * \text{Depression} \end{aligned}$$



Dummy Coding Binary Variables

$$E(\text{PHC} | X) = 5247 - 353 * \text{Poverty} - 56 * \text{Depression}$$

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5247.448	20.605	254.665	.000
Poverty	-353.131	53.819	-6.561	.000
Not In Poverty	0	.	.	.
Depression Centered	-56.011	4.434	-12.633	.000

Not in Poverty Group (Reference):

Poverty = 0

In Poverty Group (Comparison):

Poverty = 1

$$E(\text{PHC} | X) = 5247 - 56 * \text{Depression}$$



Dummy Coding Binary Variables

$$E(\text{PHC} | X) = 5247 - 353 * \text{Poverty} - 56 * \text{Depression}$$

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5247.448	20.605	254.665	.000
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Not In Poverty	0	.	.	.
Depression Centered	-56.011	4.434	-12.633	.000

Not in Poverty Group (Reference):

Poverty = 0

$$E(\text{PHC} | X) = 5247 - 56 * \text{Depression}$$

In Poverty Group (Comparison):

Poverty = 1

$$E(\text{PHC} | X) = 5247 - 353 * 1 - 56 * \text{Depression}$$



Dummy Coding Binary Variables

$$E(\text{PHC} | X) = 5247 - 353 * \text{Poverty} - 56 * \text{Depression}$$

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5247.448	20.605	254.665	.000
Poverty	-353.131	53.819	-6.561	.000
Not In Poverty	0	.	.	.
Depression Centered	-56.011	4.434	-12.633	.000

Not in Poverty Group (Reference):

Poverty = 0

$$E(\text{PHC} | X) = 5247 - 56 * \text{Depression}$$

In Poverty Group (Comparison):

Poverty = 1

$$\begin{aligned} E(\text{PHC} | X) &= 5247 - 353 * 1 - 56 * \text{Depression} \\ &= 4894 - 56 * \text{Depression} \end{aligned}$$

Dummy Coding Binary Variables

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5247.448	20.605	254.665	.000
Poverty	-353.131	53.819	-6.561	.000
Not In Poverty	0	.	.	.
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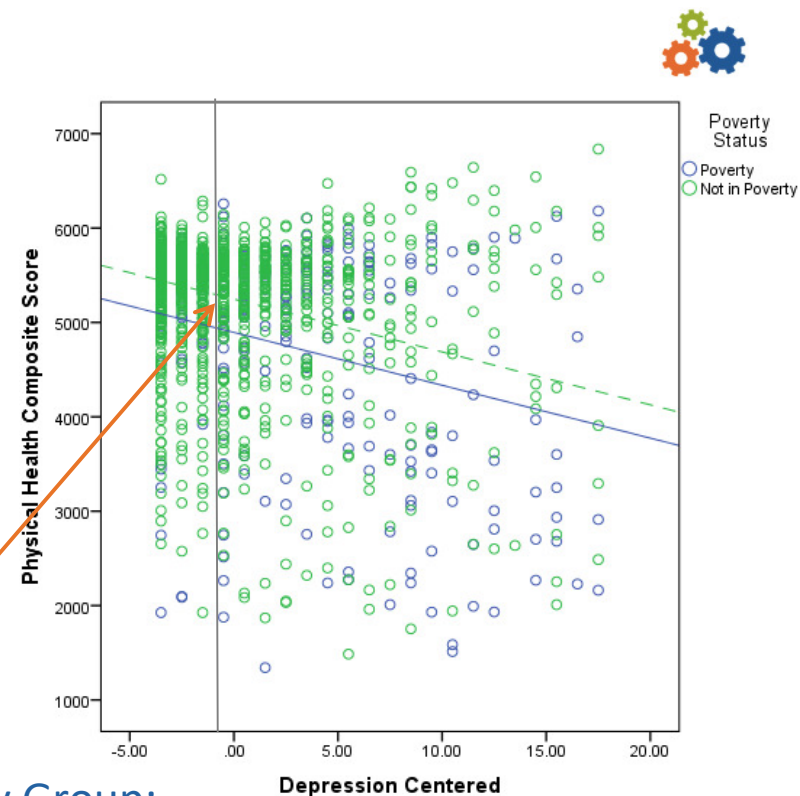
Difference in intercepts

Not in Poverty Group:

$$E(\text{PHC} | X) = 5247 - 56 * \text{Depression}$$

In Poverty Group:

$$E(\text{PHC} | X) = 4894 - 56 * \text{Depression}$$



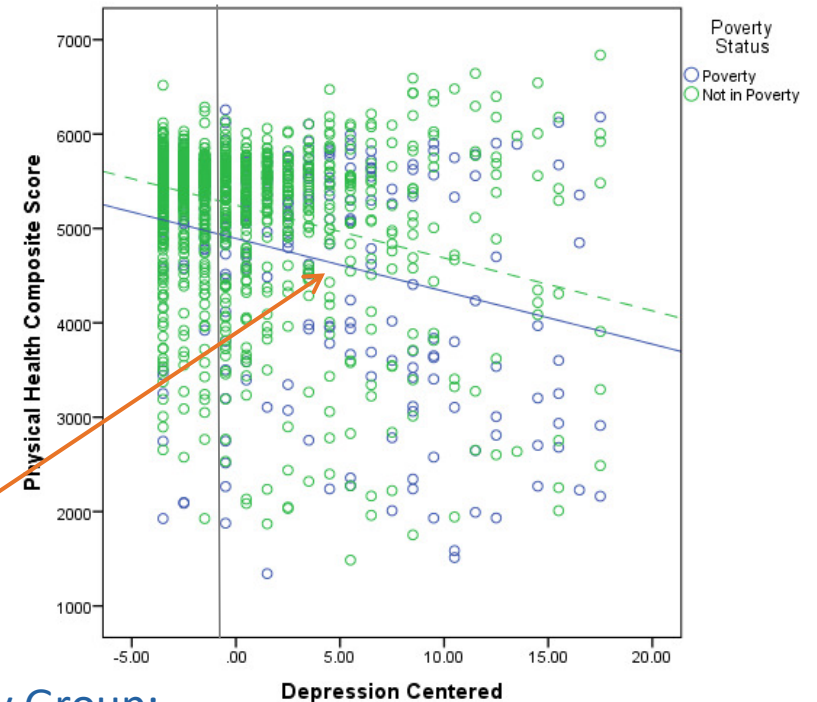
Dummy Coding Binary Variables

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5247.448	20.605	254.665	.000
Poverty	-353.131	53.819	-6.561	.000
Not In Poverty	0	.	.	.
Depression Centered	-56.011	4.434	-12.633	.000

Slope of both
lines



Not in Poverty Group:

$$E(\text{PHC} | X) = 5247 - 56 * \text{Depression}$$

In Poverty Group:

$$E(\text{PHC} | X) = 4894 - 56 * \text{Depression}$$



Interactions Between a Dummy-Coded Binary and a Numerical Predictor

Interactions Between a Binary and a Numerical Predictor



One binary predictor: Poverty Status

One numerical predictor: Depression

Interaction

ANOVA

Dependent Variable: PCS

Source	Type III Sum of Squares	df	Mean Square	F	p
Model	168549239.008 ^a	3	56183079.669	94.539	.000
Poverty Status	15822101.072	1	15822101.072	26.624	.000
Depression Centered	96956714.818	1	96956714.818	163.148	.000
Poverty Status * Depression Centered	6288295.630	1	6288295.630	10.581	.001
Error	1007911146.547	1696	594287.233		
Total	1176460385.555	1699			

Interactions Between a Binary and a Numerical Predictor



One binary predictor: Poverty Status

One numerical predictor: Depression

Interaction

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
Not In Poverty	0	.	.	.
Depression Centered	-47.170	5.190	-9.089	.000
Poverty * Depression Centered	-32.235	9.910	-3.253	.001
Not In Poverty * Depression Centered	0	.	.	.

Interactions Between a Binary and a Numerical Predictor

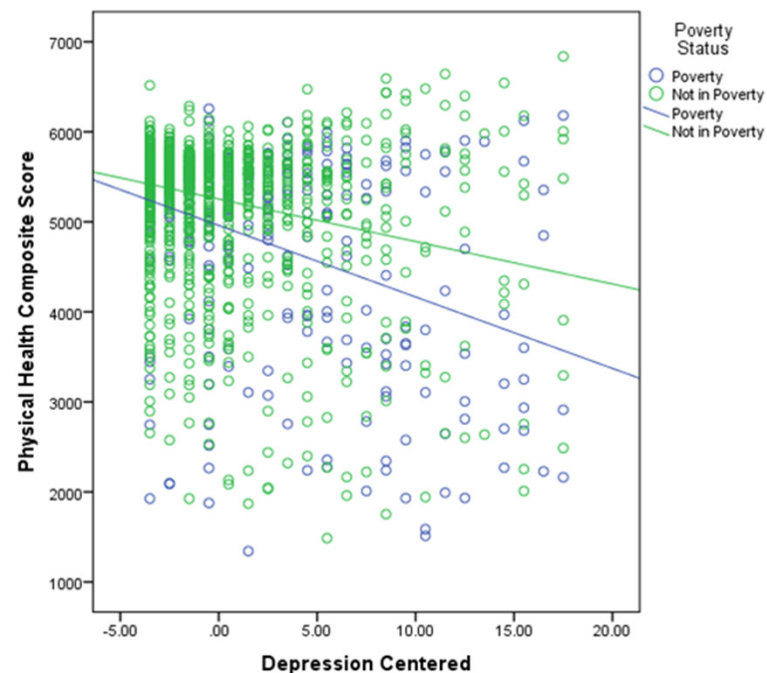


Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
Depression Centered	-47.170	5.190	-9.089	.000
Poverty * Depression Centered	-32.235	9.910	-3.253	.001

Why two non-parallel regression lines from this table?





Interpreting Coefficients With an Interaction Between a Dummy-Coded Binary and a Numerical Predictor

Numerical Predictor is Key Variable

Interactions Between a Binary and a Numerical Predictor

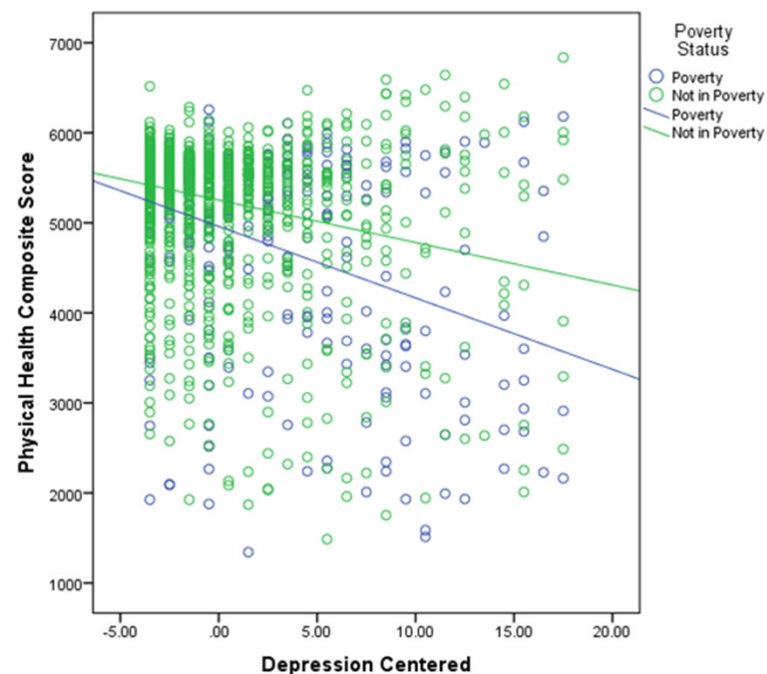


Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
Depression Centered	-47.170	5.190	-9.089	.000
Poverty * Depression Centered	-32.235	9.910	-3.253	.001

Focus on
Slopes



Interactions Between a Binary and a Numerical Predictor



Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
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Poverty * Depression Centered	-32.235	9.910	-3.253	.001

$$E(\text{PHC} | X) = 5253 - 293 * \text{Poverty} - 47 * \text{Depression} - 32 * \text{Poverty} * \text{Depression}$$

Interactions Between a Binary and a Numerical Predictor



Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
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$$E(\text{PHC} | X) = 5253 - 293 * \text{Poverty} - 47 * \text{Depression} - 32 * \text{Poverty} * \text{Depression}$$

Not in Poverty Group (Reference):

Poverty = 0

Interactions Between a Binary and a Numerical Predictor



Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
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Not in Poverty Group (Reference):

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$$E(\text{PHC} | X) = 5253 - 293 * 0 - 47 * \text{Depression} - 32 * 0 * \text{Depression}$$

Interactions Between a Binary and a Numerical Predictor



Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
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$$E(\text{PHC} | X) = 5253 - 293 * \text{Poverty} - 47 * \text{Depression} - 32 * \text{Poverty} * \text{Depression}$$

Not in Poverty Group (Reference):

Poverty = 0

$$E(\text{PHC} | X) = 5253 - 293 * 0 - 47 * \text{Depression} - 32 * 0 * \text{Depression}$$

$$E(\text{PHC} | X) = 5253 - 47 * \text{Depression}$$

Interactions Between a Binary and a Numerical Predictor



Regression Coefficients

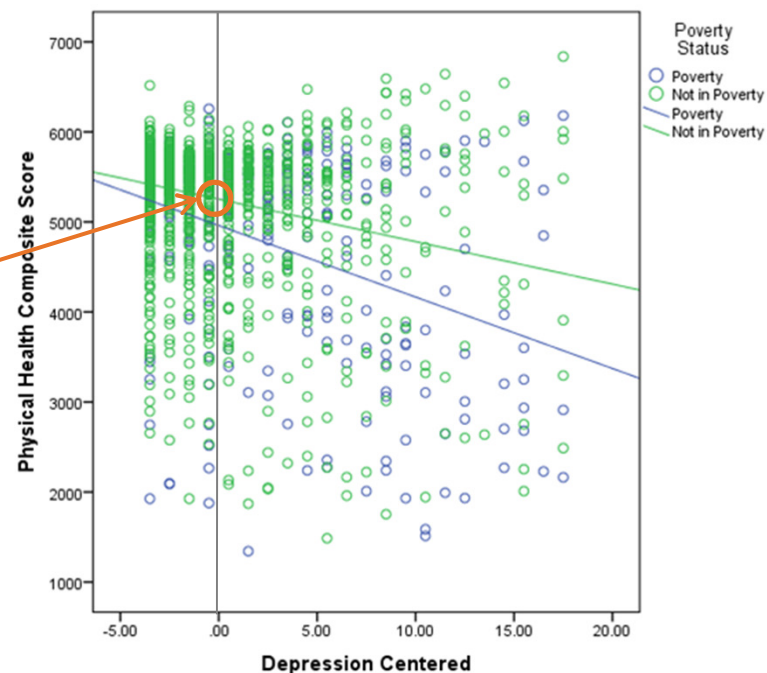
Dependent Variable: PCS

Variable	B	se	t	p
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Depression Centered	-47.170	5.190	-9.089	.000
Poverty * Depression Centered	-32.235	9.910	-3.253	.001

Reference
Group
Intercept

Not in Poverty Group (Reference):

$$E(\text{PHC} | X) = 5253 - 47 * \text{Depression}$$



Interactions Between a Binary and a Continuous Predictor



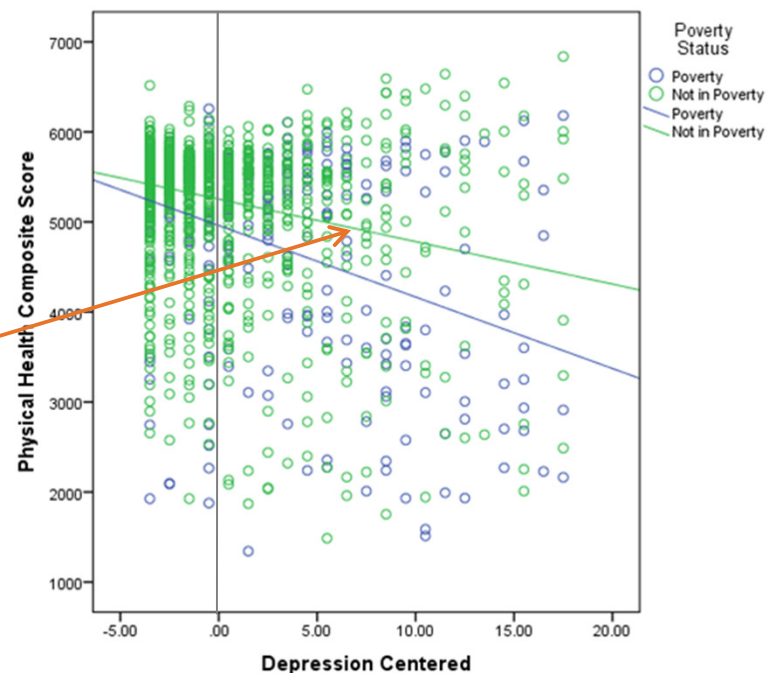
Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
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Poverty	-292.922	56.770	-5.160	.000
Depression Centered	-47.170	5.190	-9.089	.000
Poverty * Depression Centered	-32.235	9.910	-3.253	.001

Reference
Group Slope of
Depression

Not in Poverty Group (Reference):
 $E(PHC|X) = 5253 - 47 * \text{Depression}$



Interactions Between a Binary and a Continuous Predictor



Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
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Poverty * Depression Centered	-32.235	9.910	-3.253	.001

$$E(\text{PHC} | X) = 5253 - 293 * \text{Poverty} - 47 * \text{Depression} - 32 * \text{Poverty} * \text{Depression}$$

Not in Poverty Group (Reference):

Poverty = 0

In Poverty Group (Comparison):

Poverty = 1

$$E(\text{PHC} | X) = 5253 - 47(\text{Depression})$$

Interactions Between a Binary and a Continuous Predictor



Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
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$$E(\text{PHC} | X) = 5253 - 293 * \text{Poverty} - 47 * \text{Depression} - 32 * \text{Poverty} * \text{Depression}$$

Not in Poverty Group (Reference):

Poverty = 0

$$E(\text{PHC} | X) = 5253 - 47(\text{Depression})$$

In Poverty Group (Comparison):

Poverty = 1

$$E(\text{PHC} | X) = [5253 - 293 * 1] - [47 * \text{Depression} + 32 * 1 * \text{Depression}]$$

Interactions Between a Binary and a Continuous Predictor



Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
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Poverty * Depression Centered	-32.235	9.910	-3.253	.001

$$E(\text{PHC} | X) = 5253 - 293 * \text{Poverty} - 47 * \text{Depression} - 32 * \text{Poverty} * \text{Depression}$$

Not in Poverty Group (Reference):

Poverty = 0

$$E(\text{PHC} | X) = 5253 - 47(\text{Depression})$$

In Poverty Group (Comparison):

Poverty = 1

$$\begin{aligned} E(\text{PHC} | X) &= [5253 - 293 * 1] - [47 * \text{Depression} + \\ & 32 * 1 * \text{Depression}] \\ &= 4960 - 79 * \text{Depression} \end{aligned}$$

Interactions Between a Binary and a Continuous Predictor

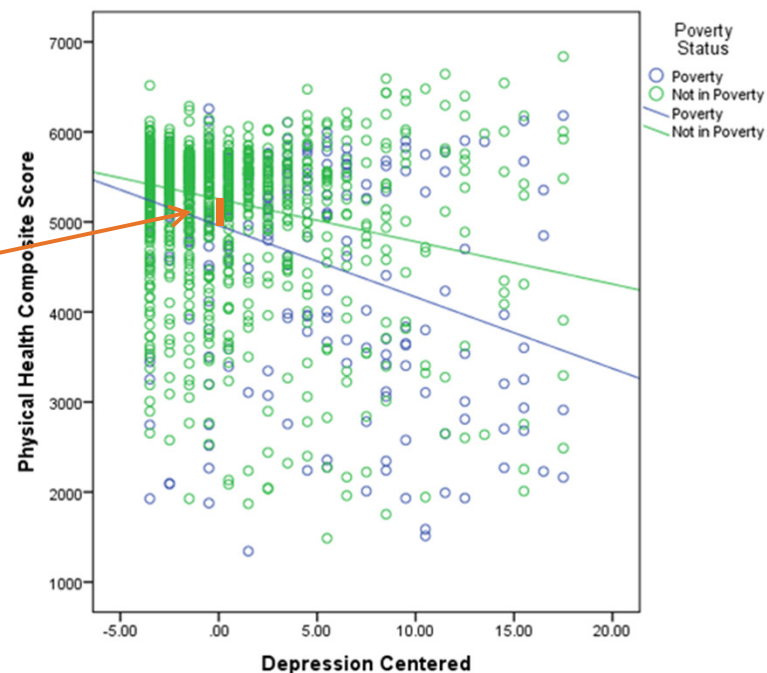


Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
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Difference in Intercepts



Not in Poverty Group (Reference):
 $E(\text{PHC} | X) = 5253 - 47(\text{Depression})$

In Poverty Group (Comparison):
 $E(\text{PHC} | X) = 4960 - 79 * \text{Depression}$

Interactions Between a Binary and a Continuous Predictor

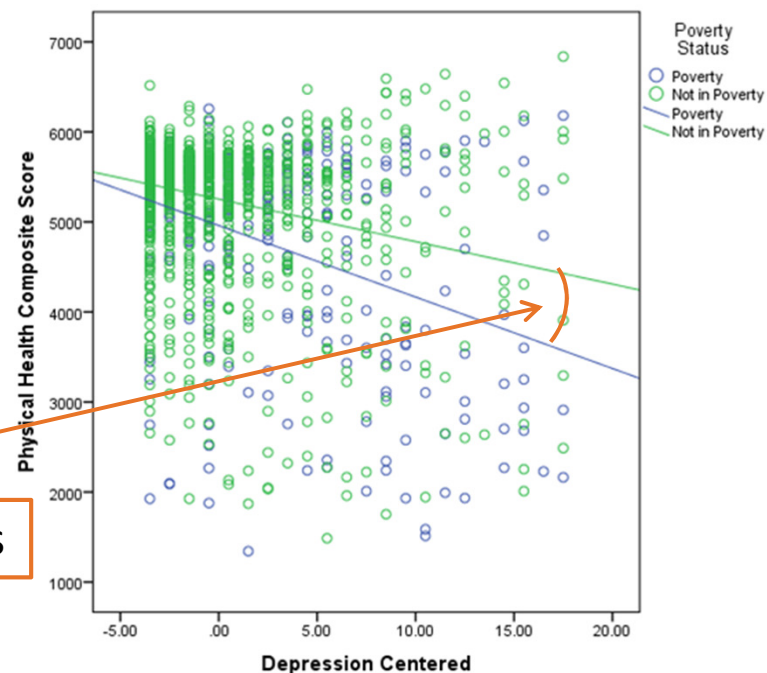


Regression Coefficients

Dependent Variable: PCS

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Poverty * Depression Centered	-32.235	9.910	-3.253	.001

Difference in Slopes



Not in Poverty Group (Reference):

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In Poverty Group (Comparison):

$$E(\text{PHC} | X) = 4960 - 79 * \text{Depression}$$



Interpreting Coefficients With an Interaction Between a Dummy-Coded Binary and a Numerical Predictor

Binary Predictor is Key Variable

Interactions Between a Binary and a Continuous Predictor

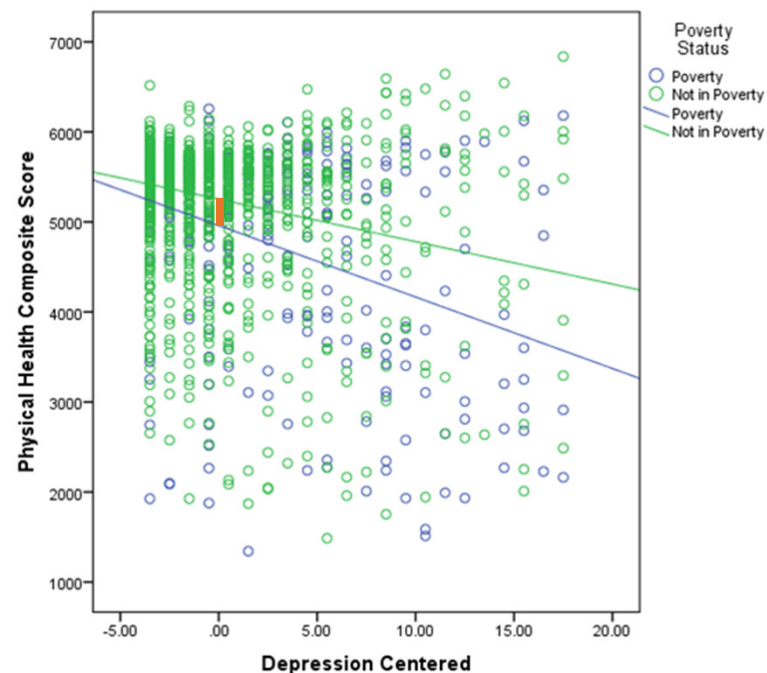


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Dependent Variable: PCS

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Focus on mean differences at specific values of Depression



Interactions Between a Binary and a Continuous Predictor

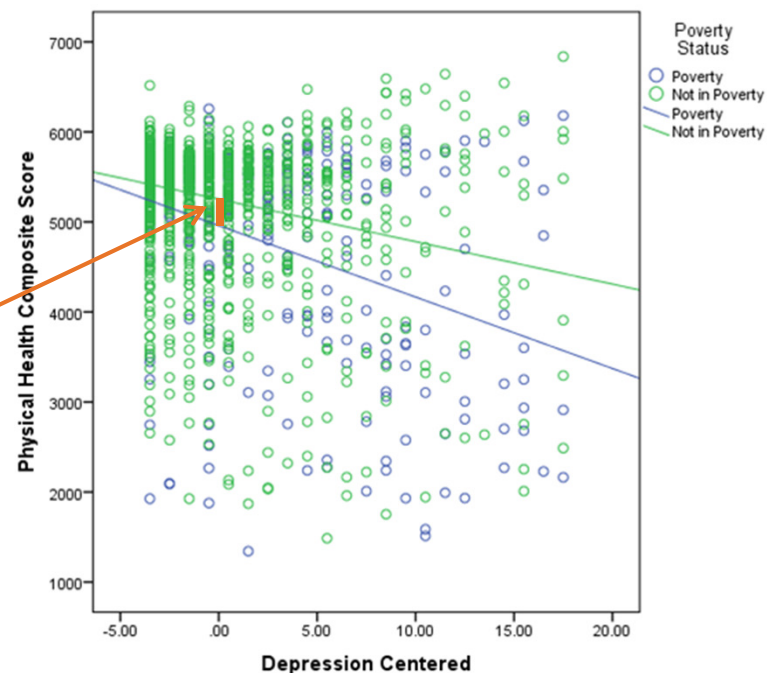


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Difference in
E(PCS | Depression = Mean)



Interactions Between a Binary and a Continuous Predictor

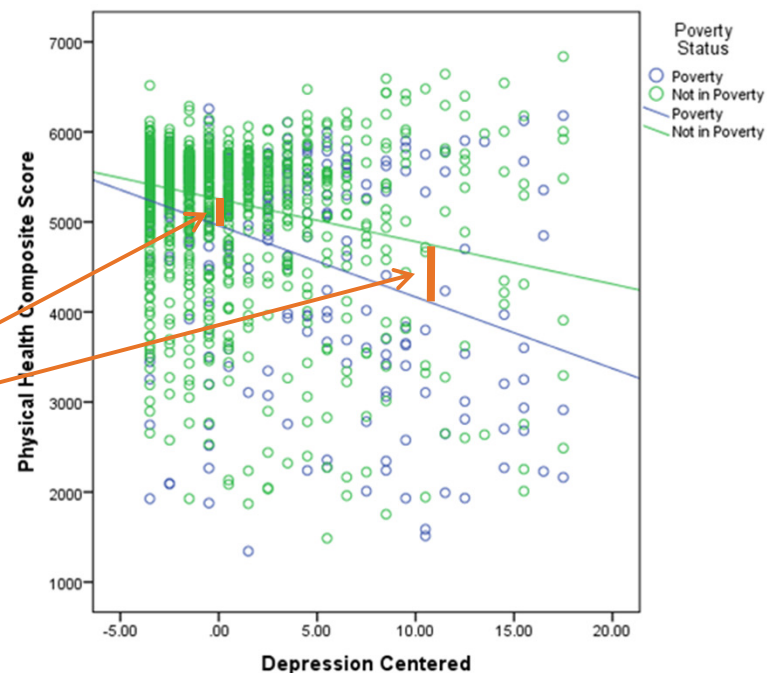


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Depression Centered	-47.170	5.190	-9.089	.000
Poverty * Depression Centered	-32.235	9.910	-3.253	.001

How much different are the mean PCS differences between In Poverty and Not in Poverty groups when
Depression = mean
and
Depression = mean + 10?



Interactions Between a Binary and a Continuous Predictor



Marginal Means

Dependent Variable: PCS

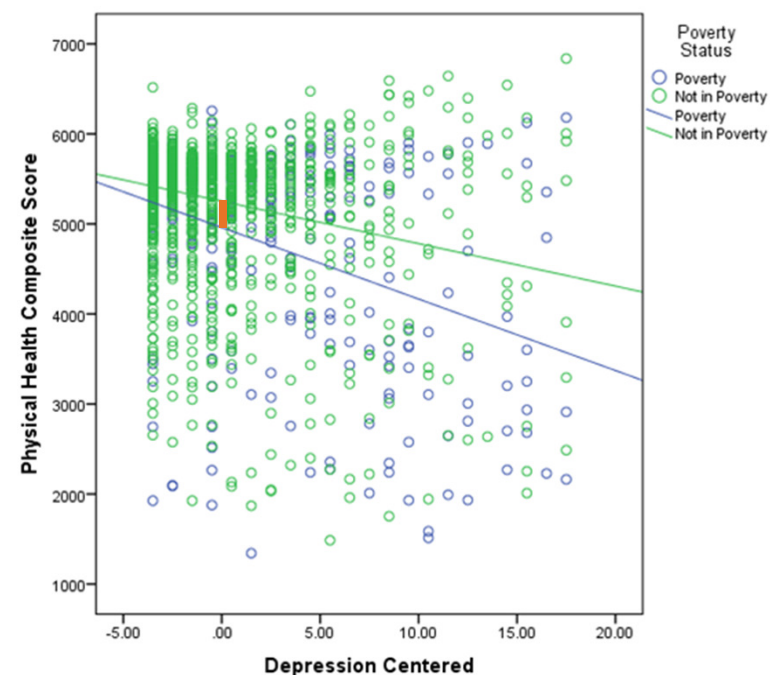
Poverty Status	Mean	se
Poverty	4960.099 ^a	52.893
Not in Poverty	5253.021 ^a	20.619

a. Covariates appearing in the model are evaluated at the following values: CESDCen = .00

Pairwise Comparisons

Dependent Variable: PCS

Comparison	Mean Difference	se	p
In Poverty - Not in Poverty	-292.922*	56.770	.000



Interactions Between a Binary and a Continuous Predictor



Marginal Means

Dependent Variable: PCS

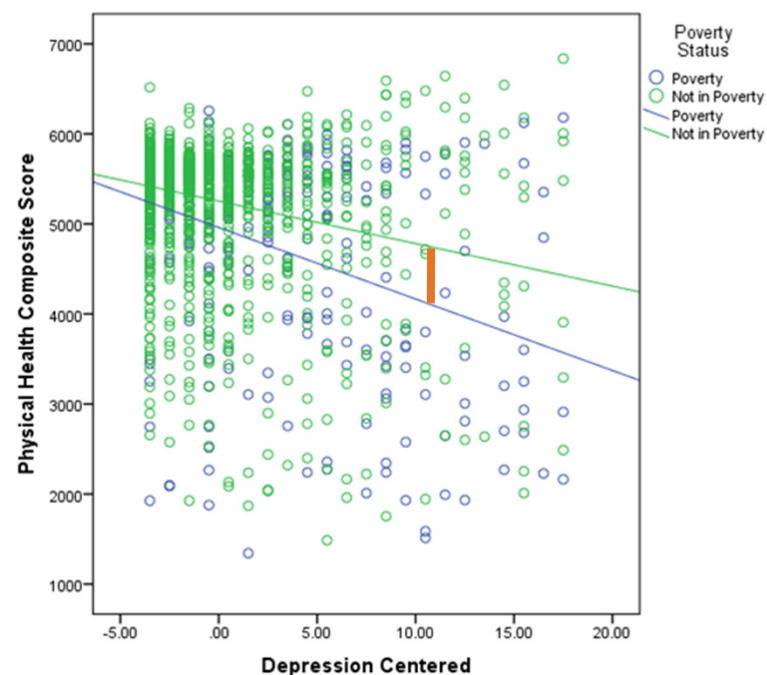
Poverty Status	Mean	se
Poverty	4166.056 ^a	76.917
Not in Poverty	4781.324 ^a	58.806

a. At Depression Centered = 10

Pairwise Comparisons

Dependent Variable: PCS

Comparison	Mean Difference	se	p
In Poverty - Not in Poverty	-615.268*	96.821	.000



Interactions Between a Binary and a Continuous Predictor



Pairwise Comparisons

Dependent Variable: PCS

Comparison	Mean Difference	se	p
In Poverty - Not in Poverty	-292.922*	56.770	.000

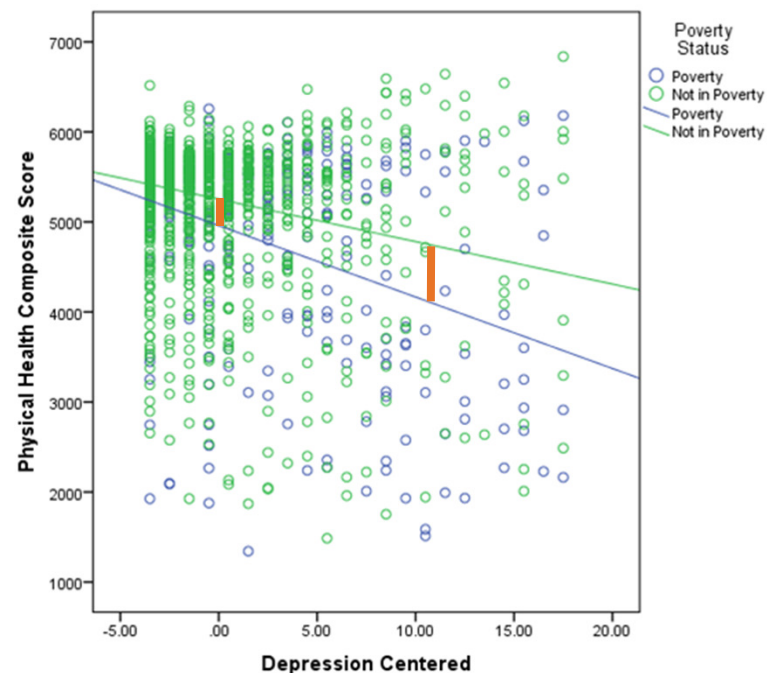
Pairwise Comparisons

Dependent Variable: PCS

Comparison	Mean Difference	se	p
In Poverty - Not in Poverty	-615.268*	96.821	.000

Difference in mean differences when depression increases by 10:

$$-292.922 - 615.268 = -322.346$$



Interactions Between a Binary and a Continuous Predictor



Pairwise Comparisons

Dependent Variable: PCS

Comparison	Mean Difference	se	p
In Poverty - Not in Poverty	-292.922*	56.770	.000

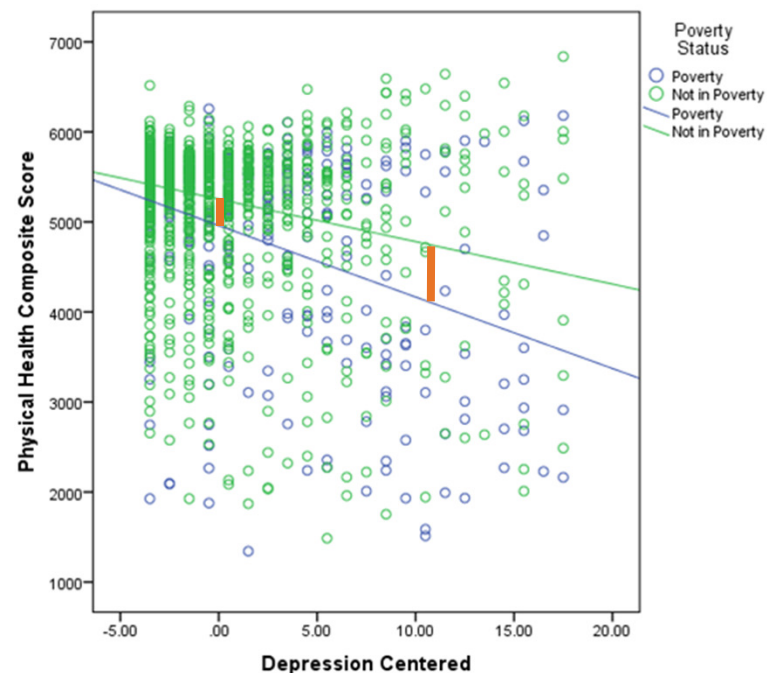
Pairwise Comparisons

Dependent Variable: PCS

Comparison	Mean Difference	se	p
In Poverty - Not in Poverty	-615.268*	96.821	.000

Difference in mean differences when depression increases by 10:

$$-292.922 - 615.268 = -32.235 * 10$$



Interactions Between a Binary and a Continuous Predictor



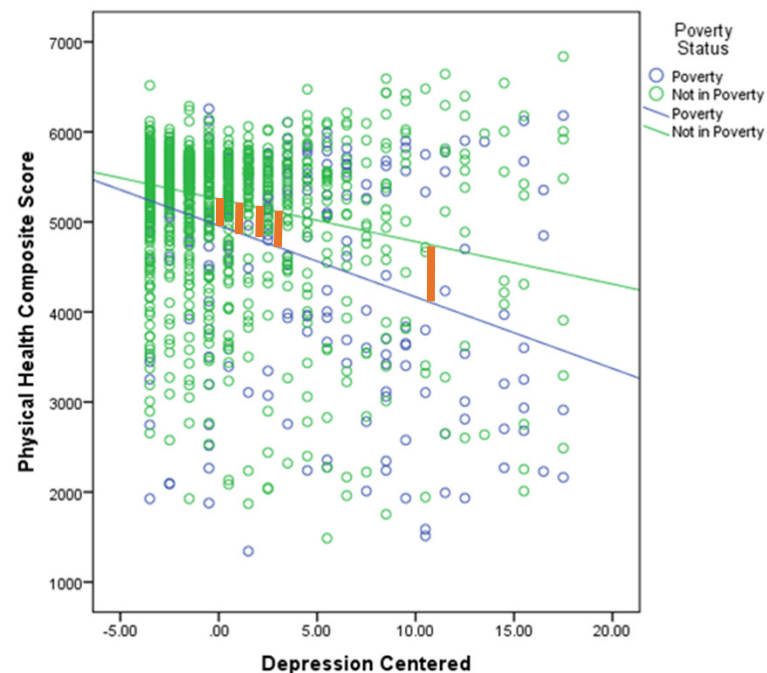
Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
Depression Centered	-47.170	5.190	-9.089	.000
Poverty * Depression Centered	-32.235	9.910	-3.253	.001

Difference in mean differences when
depression increases by 1:

$$= -32.235$$



Interactions Between a Binary and a Continuous Predictor



Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	5253.021	20.619	254.770	.000
Poverty	-292.922	56.770	-5.160	.000
Depression Centered	-47.170	5.190	-9.089	.000
Poverty * Depression Centered	-32.235	9.910	-3.253	.001

Regression Coefficients

Dependent Variable: PCS

Variable	B	se	t	p
Intercept	4781.324	58.806	81.307	.000
Poverty	-615.268	96.821	-6.355	.000
Depression Centered at 13.5	-47.170	5.190	-9.089	.000
Poverty * Depression Centered at 13.5	-32.235	9.910	-3.253	.001

