

# Multiple regressions and interactions

April 4, 2018

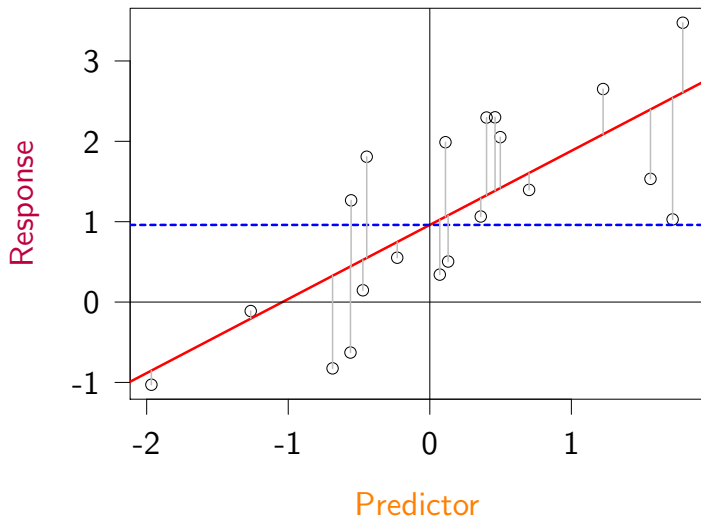
1 Linear model, reminder

2 Multiple regression

3 Interaction

# A simple linear model

$$\text{Response} = \text{Intercept} + \text{Slope} \times \text{Predictor} + \text{Error}$$



# A simple linear model

**Response** = **Intercept** + **Slope1** × **Predictor1** + **Slope2** × **Predictor2** +  
Error

**In R:**

```
lm(response ~ 1 + predictor1 + predictor2, data=data)
```

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# Warnings

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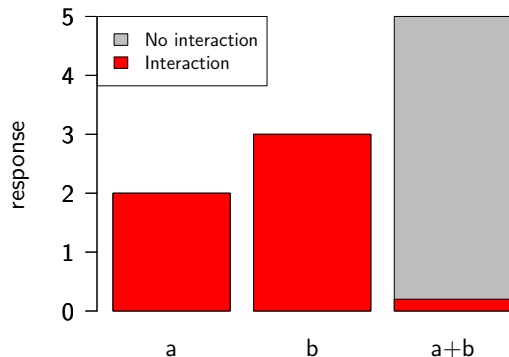
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# Fitting an interaction

```
lm(y ~ 1 + x1 * x2)
```

```
lm(y ~ 1 + x1 + x2 + x1:x2)
```

# Fitting an interaction

```
lm(y ~ 1 + x1 * x2)
lm(y ~ 1 + x1 + x2 + x1:x2)
```

```
summary(lm(y~ 1 + x1*x2))
```

Call:

```
lm(formula = y ~ 1 + x1 * x2)
```

Residuals:

Min	1Q	Median	3Q	Max
-1.8719	-0.6777	-0.1086	0.5897	2.3166

Coefficients:

	Estimate	Std. Error	t value	Pr(> t )
(Intercept)	1.14098	0.09578	11.913	< 2e-16 ***
x1	-0.49281	0.10834	-4.549	1.58e-05 ***
x2	0.53434	0.09881	5.408	4.67e-07 ***
x1:x2	0.35911	0.11449	3.137	0.00227 **
---				

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```
x1Xx2 <- x1*x2
```

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```
x1Xx2 <- x1*x2
```

```
summary(lm(y ~ 1 + x1 + x2 + x1Xx2))
```

```
Call: lm(formula = y ~ 1 + x1 + x2 + x1Xx2)
```

```
Residuals: Min 1Q Median 3Q Max -1.8719 -0.6777 -0.1086 0.5897 2.3166
```

```
Coefficients: Estimate Std. Error t value Pr(>|t|) (Intercept) 1.14098 0.09  
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5.408 4.67e-07 *** x1Xx2 0.35911 0.11449 3.137 0.00227 ** --- Signif. codes  
0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
Residual standard error: 0.9468 on 96 degrees of freedom Multiple R-squared  
0.4252, Adjusted R-squared: 0.4072 F-statistic: 23.67 on 3 and 96 DF, p-val  
1.49e-11
```

# Fitting an interaction

Why the multiplication sign?

Really a multiplication, but can be complicated for factors



# Warnings

## Modeling warning!

- ~~DO NOT COMPARE P-VALUES OF TWO MODELS TO TEST FOR AN INTERACTION~~

## Exercise

- 1 Load the data `massex.csv`
- 2 Fit a simple regression explaining movement by mass for each sex separately. Is the relationship different between sexes?
- 3 Fit the multiple regression explaining movement by mass, sex, and `mass:sex`, using the full dataset. Is the relationship different between sexes?
- 4 Try to understand the discrepancy by plotting the data

# Warnings

1.

```
masssex <- read.csv(file="masssex.csv")
```

# Warnings

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```
massex <- read.csv(file="massex.csv")
```

2.

```
summary(lm(movement ~ mass, data=massex[massex$sex==0,]))  
summary(lm(movement ~ mass, data=massex[massex$sex==1,]))
```

# Warnings

1.

```
massex <- read.csv(file="massex.csv")
```

2.

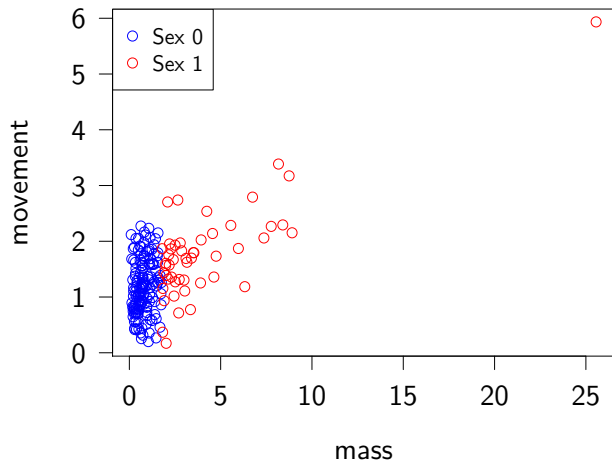
```
summary(lm(movement ~ mass, data=massex[massex$sex==0,]))  
summary(lm(movement ~ mass, data=massex[massex$sex==1,]))
```

3.

```
summary(lm(movement ~ mass*sex, data=massex))
```

# Warnings

4.



# Next times

- April 20th Kevin on ggplot
- May 4th Nina on Structural Equation Modeling
- then, mixed models and GLM
- **Other requests?**