

Growth Rate Analysis

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```
# Load Packages
library("plyr")
library("dplyr")

##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:plyr':
##
##   arrange, count, desc, failwith, id, mutate, rename, summarise,
##   summarize

## The following objects are masked from 'package:stats':
##
##   filter, lag

## The following objects are masked from 'package:base':
##
##   intersect, setdiff, setequal, union

library("reshape2")
library("ggplot2")
library("AICcmodavg")

# Load Data Frame
df.blacktemp <- read.csv("Temp_Data_Black.csv")
df.coppertemp <- read.csv("Temp_Data_Copper.csv")
df.growth <- read.csv("Fish_Measurement_Data_w_IDs.csv")

# Subset Dataframe to Include only Those Necessary for Analysis
df.subgrowth <- subset(df.growth, select = c("Date", "Died_0_Lived_1", "Length_mm",
                                             "Weight_g", "Experimental_Treatment_C", "Bucket" ))

# Remove columns with any NAs
df.completegrowth <- na.omit(df.subgrowth)

df.completegrowth$exp.temp <- c(rep(10.51111, 12), rep(10.58704, 8), rep(13.46111, 12),
                                rep(13.71667, 12), rep(15.10000, 12), rep(17.15000, 4),
                                rep(17.97037, 16), rep(19.22222, 12), rep(18.90926, 8),
                                rep(19.98889, 4), rep(19.91852, 4), rep(21.03333, 8),
                                rep(21.40741, 4), rep(22.01296, 8))

## Length Data ##
# Get measurement data from first day and last day of experiment
correct.day.cp <- which(df.completegrowth$Date==20150704)
start.length.cp <- tapply(df.completegrowth$Length_mm[correct.day.cp],
                           df.completegrowth$exp.temp[correct.day.cp], mean)
```

```

last.day.cp <- which(df.completegrowth$Date==20150718)
end.length.cp <- tapply(df.completegrowth$Length_mm[last.day.cp],
                        df.completegrowth$exp.temp[last.day.cp], mean, na.rm=TRUE)

# Create data frames for starting data and ending data and merge them
df.start.length.cp <- data.frame(bucket=names(start.length.cp), start.length.cp)
df.end.length.cp <- data.frame(bucket=names(end.length.cp), end.length.cp)
df.length.cp <- merge(df.start.length.cp, df.end.length.cp)

# Add in temperature data
# df.length.cp$exp.temp <- c(10.51111, 19.98889, 19.91852, 21.03333, 21.40741, 22.01296,
#                             10.58704, 13.46111, 13.71667, 15.10000, 17.15000, 17.97037,
#                             19.22222, 18.90926)

## Growth Data ##
# Get weight data from first day and last day of experiment
start.weight.cp <- tapply(df.completegrowth$Weight_g[correct.day.cp],
                          df.completegrowth$exp.temp[correct.day.cp], mean)
end.weight.cp <- tapply(df.completegrowth$Weight_g[last.day.cp],
                        df.completegrowth$exp.temp[last.day.cp], mean, na.rm=TRUE)

# Create data frames for starting data and ending data and merge them
df.start.weight.cp <- data.frame(bucket=names(start.weight.cp), start.weight.cp)
df.end.weight.cp <- data.frame(bucket=names(end.weight.cp), end.weight.cp)
df.weight.cp <- merge(df.start.weight.cp, df.end.weight.cp)

## Combined Data ##
# Combine Length and Weight data
df.growth.cp <- merge(df.length.cp, df.weight.cp)

### Calculate Growth Statistics ###

## Condition Factor ##

# start and end condition factor calculation
df.growth.cp$CF.start <- ((df.growth.cp$start.weight.cp)/(df.growth.cp$start.length.cp)^3)*100
df.growth.cp$CF.end <- ((df.growth.cp$end.weight.cp)/(df.growth.cp$end.length.cp)^3)*100

# Change in CF
df.growth.cp$CF.change <- (df.growth.cp$CF.end-df.growth.cp$CF.start)

## % Weight Gain ##

df.growth.cp$weight.change <- (df.growth.cp$end.weight.cp-df.growth.cp$start.weight.cp)
df.growth.cp$percent.weight <- ((df.growth.cp$weight.change/df.growth.cp$start.weight.cp)*100)

# as.numeric
df.growth.cp$exp.temp <- as.numeric(paste(df.growth.cp$bucket))

### Plots ###

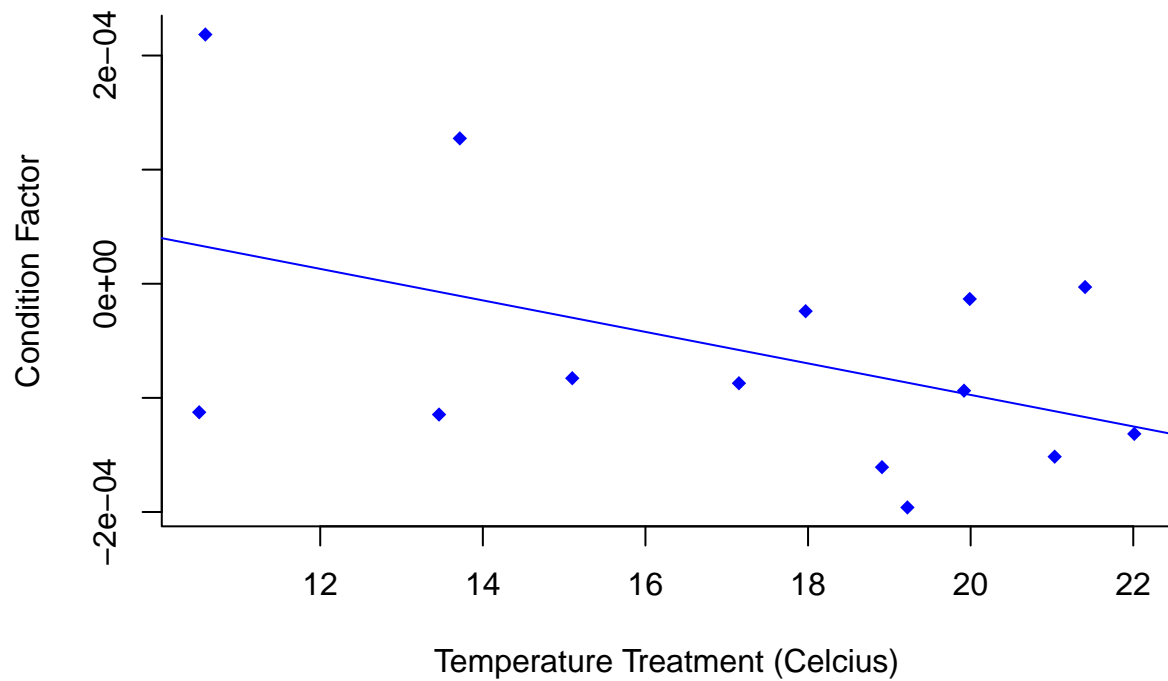
# Scatterplot

```

```
plot(df.growth.cp$exp.temp, df.growth.cp$CF.change, pch = 18,
     bty = "l", main = "Condition Factor - Copper Rockfish",
     ylab = "Condition Factor",
     xlab = "Temperature Treatment (Celcius)", col = "blue")

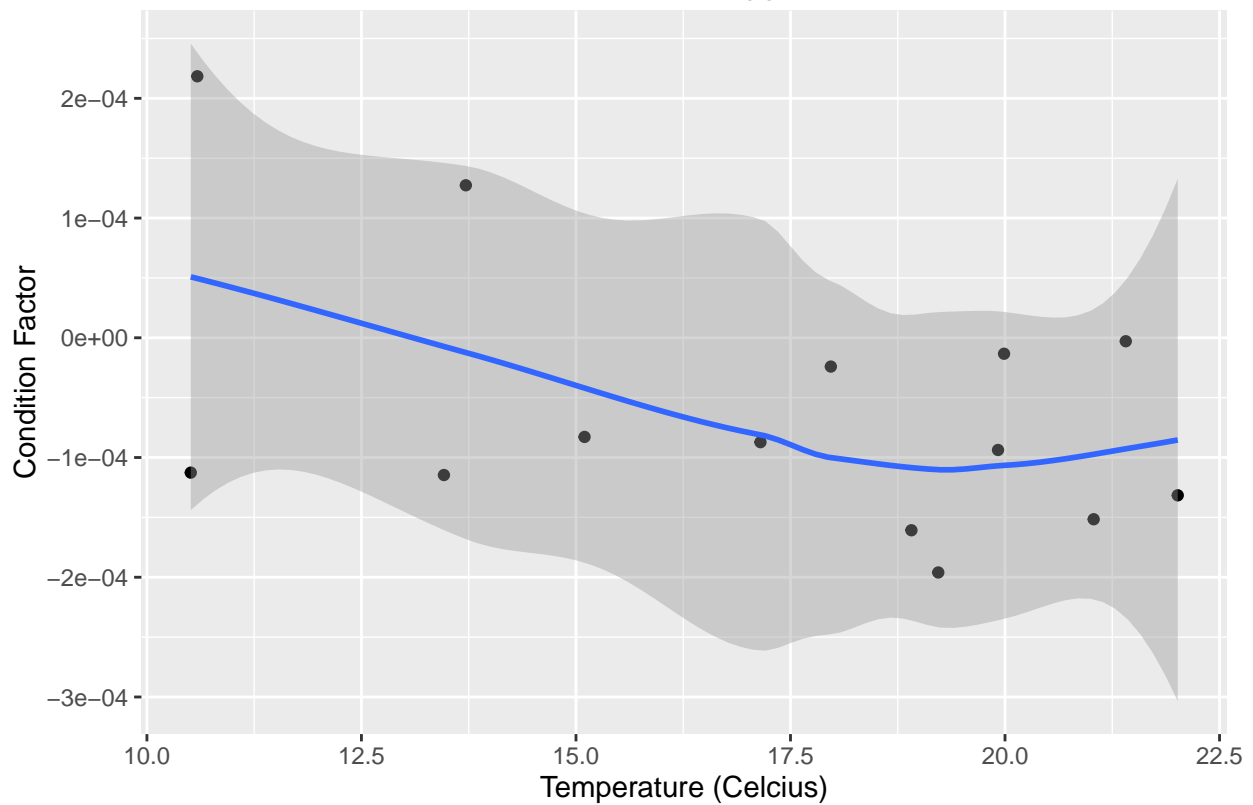
abline(lm(df.growth.cp$CF.change~df.growth.cp$exp.temp), col = "blue")
```

Condition Factor – Copper Rockfish



```
# General Additive Model (GAM)
ggplot(df.growth.cp, aes(x=exp.temp, y=CF.change)) + labs(x = "Temperature (Celcius)",
  y = "Condition Factor") + ggtitle("Condition Factor - Copper Rockfish") + geom_point() + ge
```

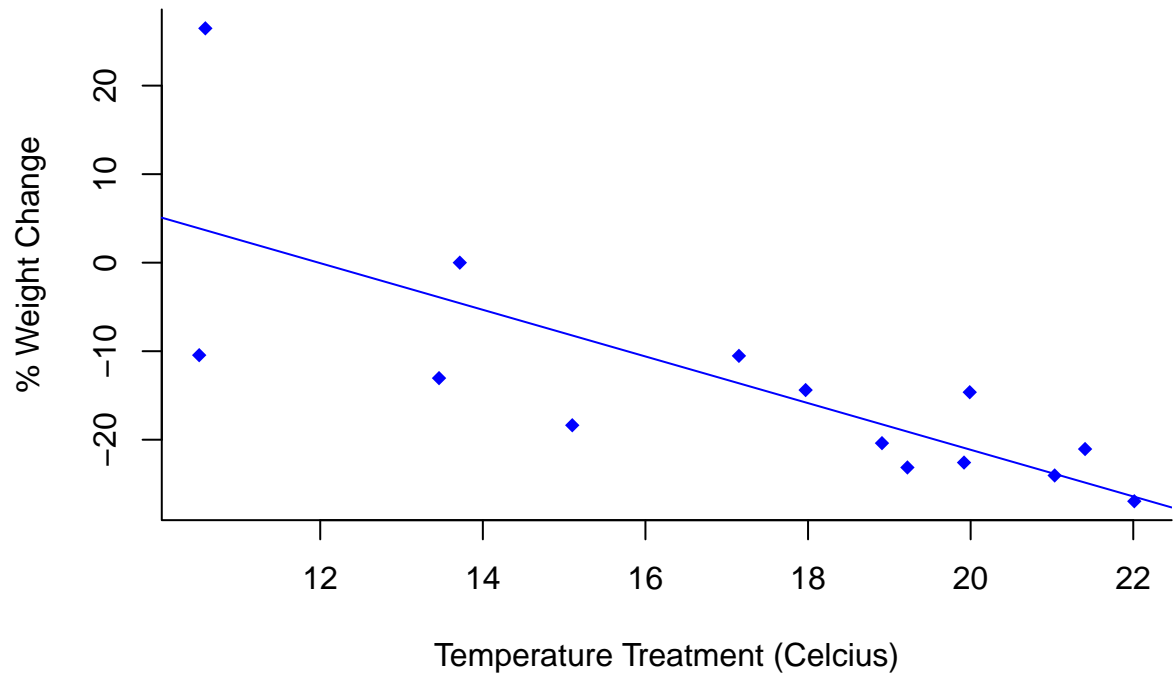
Condition Factor – Copper Rockfish



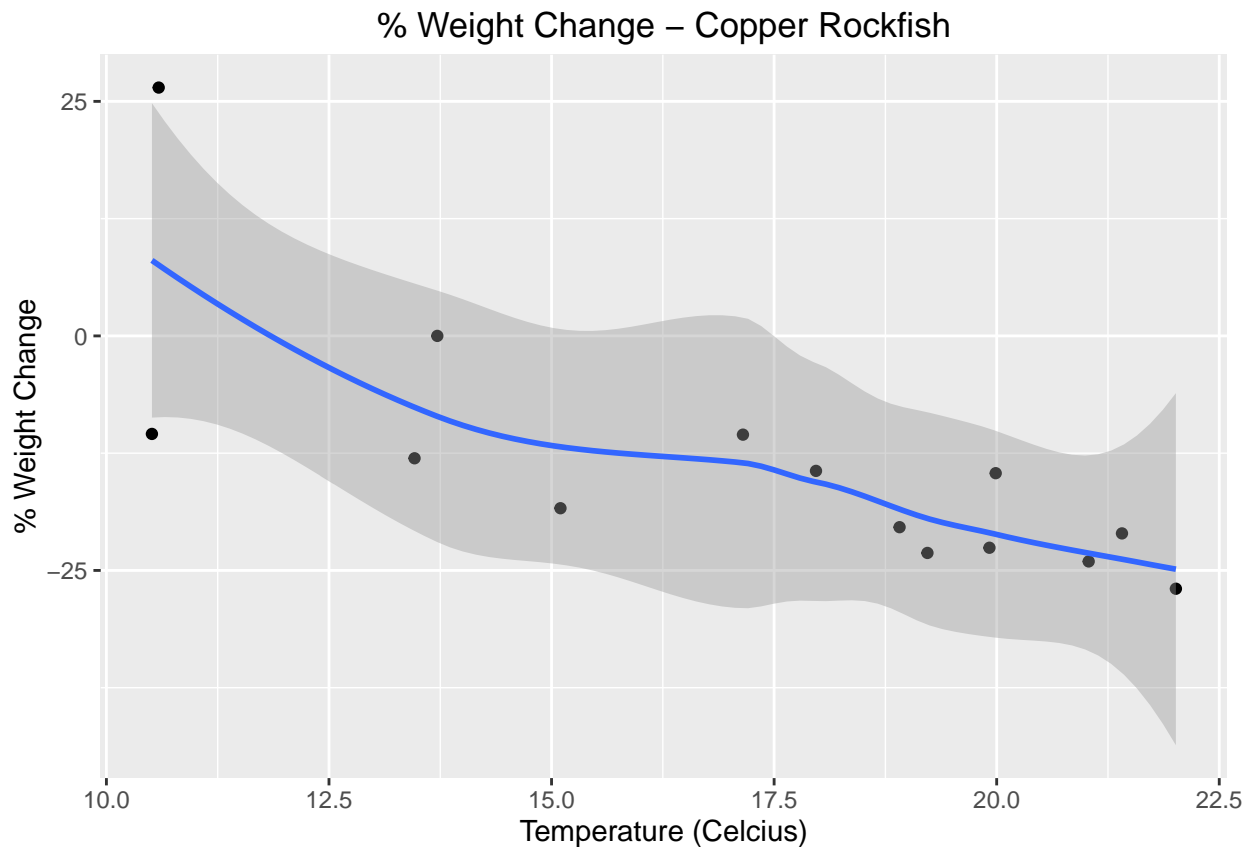
```
# Scatterplot
plot(df.growth.cp$exp.temp, df.growth.cp$percent.weight, pch = 18, bty = "l",
     main = "% Weight Change - Copper Rockfish", ylab = "% Weight Change",
     xlab = "Temperature Treatment (Celcius)", col = "blue")

abline(lm(df.growth.cp$percent.weight~df.growth.cp$exp.temp), col = "blue")
```

% Weight Change – Copper Rockfish



```
# General Additive Model (GAM)
ggplot(df.growth.cp, aes(x=exp.temp, y=percent.weight)) + labs(x = "Temperature (Celcius)",
  y = "% Weight Change") + ggtitle("% Weight Change - Copper Rockfish") + geom_point() + geom.
```



```
### Analysis ###
```

```
# Condition Factor #
```

```
full.cp.CF <- lm(df.growth.cp$CF.change~df.growth.cp$exp.temp + I(df.growth.cp$exp.temp^2)
+ df.growth.cp$start.weight.cp)
```

```
summary(full.cp.CF)
```

```
##
```

```
## Call:
```

```
## lm(formula = df.growth.cp$CF.change ~ df.growth.cp$exp.temp +
##      I(df.growth.cp$exp.temp^2) + df.growth.cp$start.weight.cp)
```

```
##
```

```
## Residuals:
```

```
##      Min      1Q   Median      3Q      Max
## -1.749e-04 -3.449e-05 -1.980e-05  5.530e-05  1.376e-04
```

```
##
```

```
## Coefficients:
```

```
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    6.434e-04  5.658e-04   1.137   0.2820
## df.growth.cp$exp.temp -6.714e-05  7.248e-05  -0.926   0.3761
## I(df.growth.cp$exp.temp^2)  1.908e-06  2.237e-06   0.853   0.4137
## df.growth.cp$start.weight.cp -3.855e-04  2.045e-04  -1.885   0.0888 .
```

```
## ---
```

```
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
##
```

```
## Residual standard error: 9.71e-05 on 10 degrees of freedom
```

```
## Multiple R-squared:  0.4442, Adjusted R-squared:  0.2774
## F-statistic: 2.664 on 3 and 10 DF,  p-value: 0.1049
```

```
drop1(full.cp.CF)
```

```
## Single term deletions
##
## Model:
## df.growth.cp$CF.change ~ df.growth.cp$exp.temp + I(df.growth.cp$exp.temp^2) +
##   df.growth.cp$start.weight.cp
##
```

	Df	Sum of Sq	RSS	AIC
<none>			9.4281e-08	-255.43
df.growth.cp\$exp.temp	1	8.0910e-09	1.0237e-07	-256.27
I(df.growth.cp\$exp.temp^2)	1	6.8580e-09	1.0114e-07	-256.44
df.growth.cp\$start.weight.cp	1	3.3508e-08	1.2779e-07	-253.17

```
# Drop start.weight
drop.start.cp.CF <- lm(df.growth.cp$CF.change~df.growth.cp$exp.temp + I(df.growth.cp$exp.temp^2))

summary(drop.start.cp.CF)
```

```
##
## Call:
## lm(formula = df.growth.cp$CF.change ~ df.growth.cp$exp.temp +
##   I(df.growth.cp$exp.temp^2))
##
## Residuals:
```

	Min	1Q	Median	3Q	Max
	-1.718e-04	-6.316e-05	-2.011e-05	7.957e-05	1.616e-04

```
##
## Coefficients:
```

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	5.467e-04	6.254e-04	0.874	0.401
df.growth.cp\$exp.temp	-6.203e-05	8.040e-05	-0.772	0.457
I(df.growth.cp\$exp.temp^2)	1.489e-06	2.471e-06	0.603	0.559

```
##
## Residual standard error: 0.0001078 on 11 degrees of freedom
## Multiple R-squared:  0.2466, Adjusted R-squared:  0.1097
## F-statistic: 1.801 on 2 and 11 DF,  p-value: 0.2106
```

```
drop1(drop.start.cp.CF)
```

```
## Single term deletions
##
## Model:
## df.growth.cp$CF.change ~ df.growth.cp$exp.temp + I(df.growth.cp$exp.temp^2)
##
```

	Df	Sum of Sq	RSS	AIC
<none>			1.2779e-07	-253.17
df.growth.cp\$exp.temp	1	6.9148e-09	1.3470e-07	-254.43
I(df.growth.cp\$exp.temp^2)	1	4.2174e-09	1.3201e-07	-254.71

```
# Drop squared term
drop.square.cp.CF <- lm(df.growth.cp$CF.change~df.growth.cp$exp.temp)
summary(drop.square.cp.CF)
```

```
##
## Call:
## lm(formula = df.growth.cp$CF.change ~ df.growth.cp$exp.temp)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -1.462e-04 -7.204e-05 -1.773e-05  7.429e-05  1.859e-04
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)      1.787e-04  1.315e-04   1.359   0.1992
## df.growth.cp$exp.temp -1.381e-05  7.466e-06  -1.849   0.0892 .
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.0001049 on 12 degrees of freedom
## Multiple R-squared:  0.2218, Adjusted R-squared:  0.1569
## F-statistic:  3.42 on 1 and 12 DF,  p-value: 0.08919
```

```
# Marginally significant 0.08919.
```

```
# % Weight Gain #
full.cp.perc <- lm(df.growth.cp$percent.weight~df.growth.cp$exp.temp
+ df.growth.cp$start.weight.cp)
summary(full.cp.perc)
```

```
##
## Call:
## lm(formula = df.growth.cp$percent.weight ~ df.growth.cp$exp.temp +
##      df.growth.cp$start.weight.cp)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -14.080   -3.898   -0.100    2.849   21.775
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)      31.1631     11.3747   2.740   0.0192 *
## df.growth.cp$exp.temp      -2.1312      0.7684  -2.774   0.0181 *
## df.growth.cp$start.weight.cp -22.9647     18.9990  -1.209   0.2521
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 9.065 on 11 degrees of freedom
## Multiple R-squared:  0.6225, Adjusted R-squared:  0.5539
## F-statistic: 9.069 on 2 and 11 DF,  p-value: 0.004711
```



```
drop1(full.cp.perc)
```

```
## Single term deletions
##
## Model:
## df.growth.cp$percent.weight ~ df.growth.cp$exp.temp + df.growth.cp$start.weight.cp
##               Df Sum of Sq    RSS   AIC
## <none>                903.98 64.349
## df.growth.cp$exp.temp      1    632.19 1536.17 69.772
## df.growth.cp$start.weight.cp 1    120.07 1024.05 64.094
```

```
# W0000000T significant.
```

Black Rockfish

```
# Subset Dataframe to Include only Those Necessary for Analysis
df.subgrowth.blk <- subset(df.growth, select = c("Date", "Length_mm",
                                                "Weight_g", "Experimental_Treatment_C",
                                                "Bucket" ))

df.growth.2<- na.omit(df.subgrowth.blk)

## Length Data ##
# Get measurement data from first day and last day of experiment
correct.day.blk <- which(df.growth.2$Date==20150620)
start.length.blk <- tapply(df.growth.2$Length_mm[correct.day.blk],
                           df.growth.2$Bucket[correct.day.blk], mean)
last.day.blk <- which(df.growth.2$Date==20150703)
end.length.blk <- tapply(df.growth.2$Length_mm[last.day.blk],
                         df.growth.2$Bucket[last.day.blk], mean, na.rm=TRUE)

# Create data frames for starting data and ending data and merge them
df.start.length.blk <- data.frame(bucket=names(start.length.blk), start.length.blk)
df.end.length.blk <- data.frame(bucket=names(end.length.blk), end.length.blk)
df.length.blk <- merge(df.start.length.blk, df.end.length.blk)

# Add in exp.temp
df.length.blk$exp.temp <- c(10.45769, 19.45192, 20.18269,
                             20.71346, 20.97308, 22.61731,
                             10.33846, 13.46111, 13.89808,
                             15.23462, 17.86923, 19.35962,
                             18.48462, 19.98462)

## Weight Data ##

start.weight.blk <- tapply(df.growth.2$Weight_g[correct.day.blk],
                           df.growth.2$Bucket[correct.day.blk], mean)
end.weight.blk <- tapply(df.growth.2$Weight_g[last.day.blk],
                         df.growth.2$Bucket[last.day.blk], mean, na.rm=TRUE)
```

```

# Create data frames for starting data and ending data and merge them
df.start.weight.blk <- data.frame(bucket=names(start.weight.blk), start.weight.blk)
df.end.weight.blk <- data.frame(bucket=names(end.weight.blk), end.weight.blk)
df.weight.blk <- merge(df.start.weight.blk, df.end.weight.blk)

## Combine Data ##

df.growth.blk <- merge(df.length.blk, df.weight.blk)

### Calculate Growth Statistics ###

## Condition Factor ##
df.growth.blk$CF.start <- ((df.growth.blk$start.weight.blk)/(df.growth.blk$start.length.blk)^3)*100
df.growth.blk$CF.end <- ((df.growth.blk$end.weight.blk)/(df.growth.blk$end.length.blk)^3)*100

# Change in CF
df.growth.blk$CF.change <- (df.growth.blk$CF.end-df.growth.blk$CF.start)

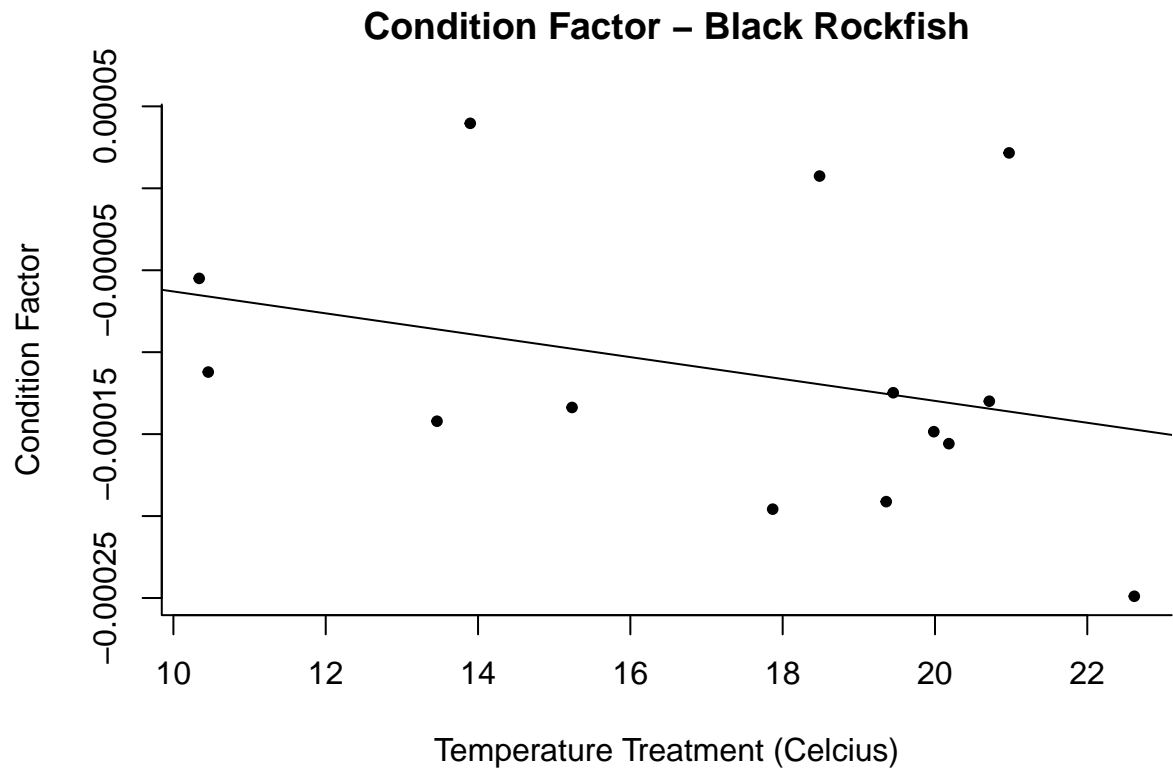
## % Weight Change ##

df.growth.blk$weight.change <- (df.growth.blk$end.weight.blk-df.growth.blk$start.weight.blk)
df.growth.blk$percent.weight <- ((df.growth.blk$weight.change/df.growth.blk$start.weight.blk)*100)

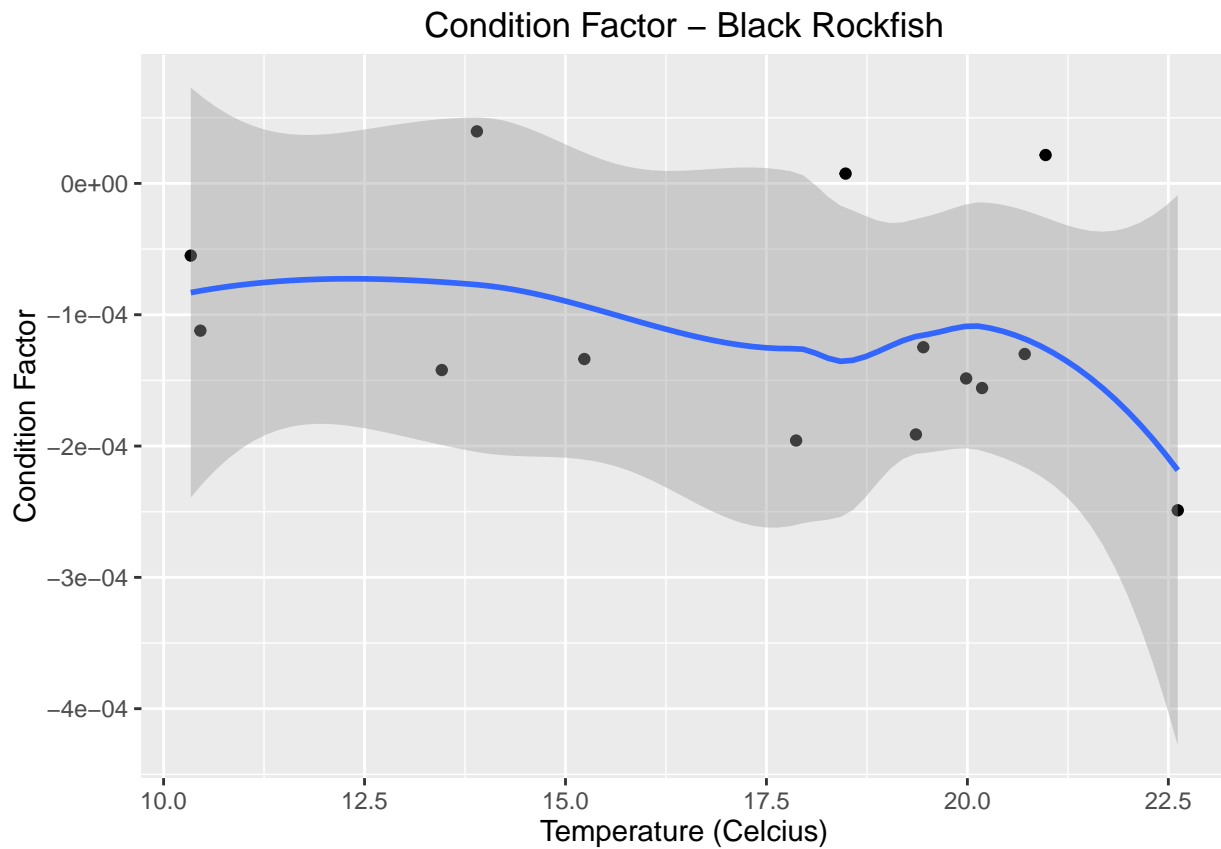
### Plots ###
plot(df.growth.blk$exp.temp, df.growth.blk$CF.change, pch = 20,
     bty = "l", main = "Condition Factor - Black Rockfish",
     ylab = "Condition Factor",
     xlab = "Temperature Treatment (Celcius)")

abline(lm(df.growth.blk$CF.change~df.growth.blk$exp.temp))

```

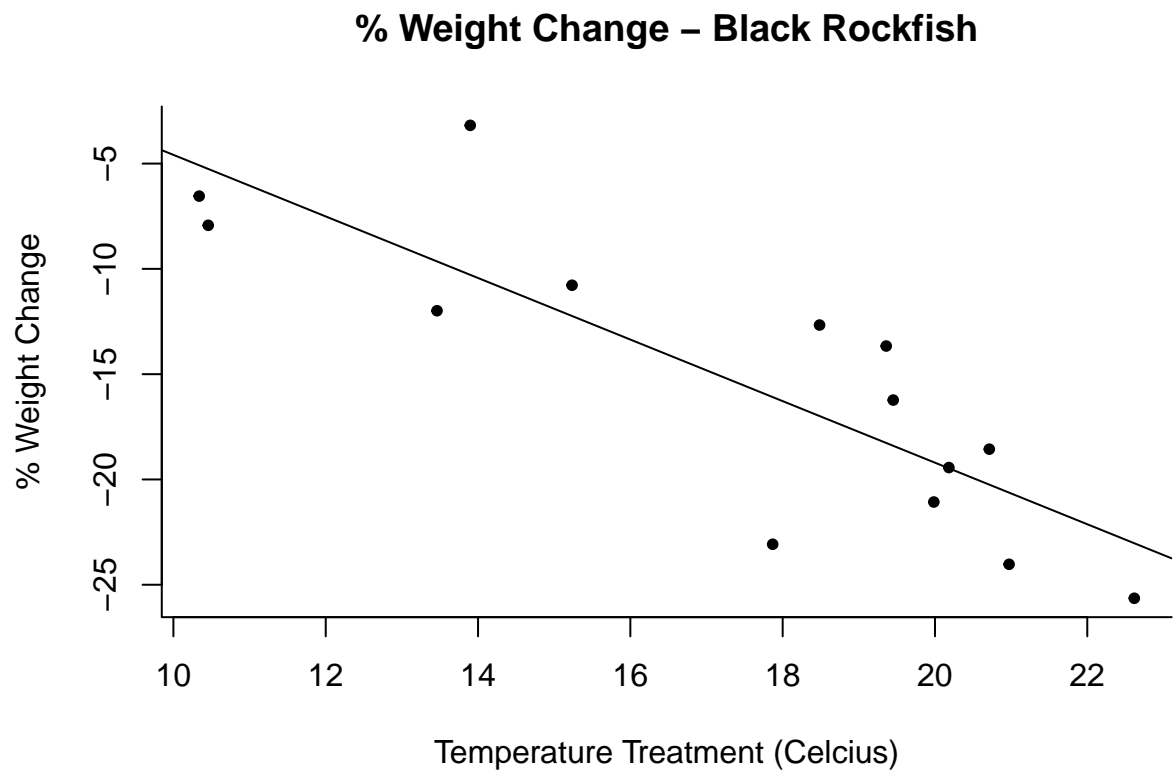


```
# General Additive Model (GAM)
ggplot(df.growth.blk, aes(x=exp.temp, y=CF.change)) + labs(x = "Temperature (Celcius)",
  y = "Condition Factor") + ggtitle("Condition Factor - Black Rockfish") + geom_point() + geom_smooth()
```

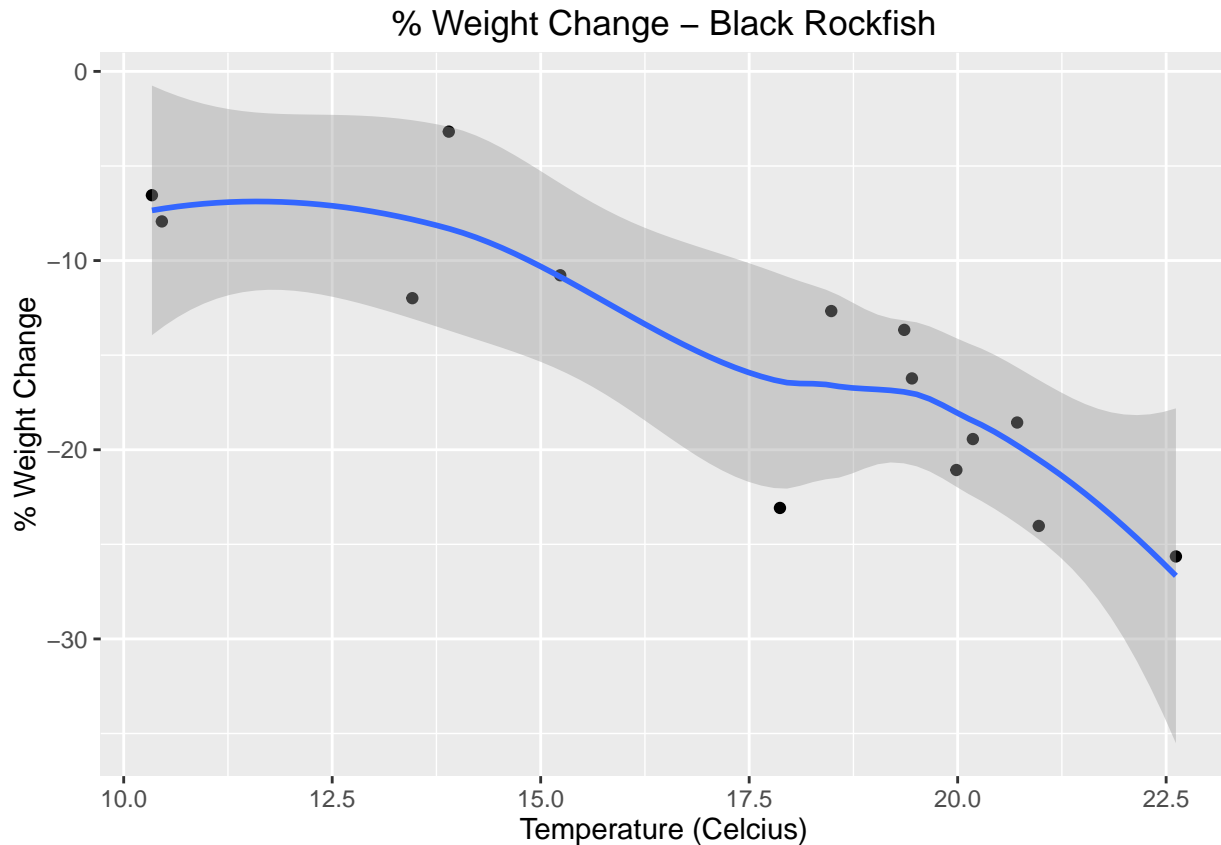


```
# Scatterplot
plot(df.growth.blk$exp.temp, df.growth.blk$percent.weight, pch = 20, bty = "l",
     main = "% Weight Change - Black Rockfish", ylab = "% Weight Change",
     xlab = "Temperature Treatment (Celcius)")

abline(lm(df.growth.blk$percent.weight~df.growth.blk$exp.temp))
```



```
# General Additive Model (GAM)
ggplot(df.growth.blk, aes(x=exp.temp, y=percent.weight)) + labs(x = "Temperature (Celcius)",
  y = "% Weight Change") + ggtitle("% Weight Change - Black Rockfish") + geom_point() + geom_
```



```
### Analysis ###
```

```
# Condition Factor #
```

```
full.blk.CF <- lm(df.growth.blk$CF.change~df.growth.blk$exp.temp + I(df.growth.blk$exp.temp^2)
                  + df.growth.blk$start.weight.blk)
summary(full.cp.CF)
```

```
##
```

```
## Call:
```

```
## lm(formula = df.growth.cp$CF.change ~ df.growth.cp$exp.temp +
##      I(df.growth.cp$exp.temp^2) + df.growth.cp$start.weight.cp)
```

```
##
```

```
## Residuals:
```

```
##      Min      1Q   Median      3Q      Max
## -1.749e-04 -3.449e-05 -1.980e-05  5.530e-05  1.376e-04
```

```
##
```

```
## Coefficients:
```

```
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    6.434e-04  5.658e-04   1.137   0.2820
## df.growth.cp$exp.temp -6.714e-05  7.248e-05  -0.926   0.3761
## I(df.growth.cp$exp.temp^2)  1.908e-06  2.237e-06   0.853   0.4137
## df.growth.cp$start.weight.cp -3.855e-04  2.045e-04  -1.885   0.0888 .
```

```
## ---
```

```
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
##
```

```
## Residual standard error: 9.71e-05 on 10 degrees of freedom
```

```
## Multiple R-squared:  0.4442, Adjusted R-squared:  0.2774
## F-statistic: 2.664 on 3 and 10 DF,  p-value: 0.1049
```

```
drop1(full.cp.CF)
```

```
## Single term deletions
##
## Model:
## df.growth.cp$CF.change ~ df.growth.cp$exp.temp + I(df.growth.cp$exp.temp^2) +
##   df.growth.cp$start.weight.cp
##
```

	Df	Sum of Sq	RSS	AIC
<none>			9.4281e-08	-255.43
df.growth.cp\$exp.temp	1	8.0910e-09	1.0237e-07	-256.27
I(df.growth.cp\$exp.temp^2)	1	6.8580e-09	1.0114e-07	-256.44
df.growth.cp\$start.weight.cp	1	3.3508e-08	1.2779e-07	-253.17

```
# Drop start.weight
```

```
drop.start.blk.CF <- lm(df.growth.blk$CF.change~df.growth.blk$exp.temp + I(df.growth.blk$exp.temp^2)
summary(drop.start.cp.CF)
```

```
##
## Call:
## lm(formula = df.growth.cp$CF.change ~ df.growth.cp$exp.temp +
##   I(df.growth.cp$exp.temp^2))
##
## Residuals:
```

	Min	1Q	Median	3Q	Max
	-1.718e-04	-6.316e-05	-2.011e-05	7.957e-05	1.616e-04

```
##
## Coefficients:
```

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	5.467e-04	6.254e-04	0.874	0.401
df.growth.cp\$exp.temp	-6.203e-05	8.040e-05	-0.772	0.457
I(df.growth.cp\$exp.temp^2)	1.489e-06	2.471e-06	0.603	0.559

```
##
## Residual standard error: 0.0001078 on 11 degrees of freedom
## Multiple R-squared:  0.2466, Adjusted R-squared:  0.1097
## F-statistic: 1.801 on 2 and 11 DF,  p-value: 0.2106
```

```
drop1(drop.start.cp.CF)
```

```
## Single term deletions
##
## Model:
## df.growth.cp$CF.change ~ df.growth.cp$exp.temp + I(df.growth.cp$exp.temp^2)
##
```

	Df	Sum of Sq	RSS	AIC
<none>			1.2779e-07	-253.17
df.growth.cp\$exp.temp	1	6.9148e-09	1.3470e-07	-254.43
I(df.growth.cp\$exp.temp^2)	1	4.2174e-09	1.3201e-07	-254.71

```

# Best model but not significant

# Drop squared term
drop.square.blk.CF <- lm(df.growth.blk$CF.change~df.growth.blk$exp.temp)
summary(drop.square.blk.CF)

##
## Call:
## lm(formula = df.growth.blk$CF.change ~ df.growth.blk$exp.temp)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -1.017e-04 -5.358e-05 -2.190e-05  8.824e-06  1.578e-04
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)      3.812e-06  1.052e-04   0.036   0.972
## df.growth.blk$exp.temp -6.676e-06  5.921e-06  -1.128   0.282
##
## Residual standard error: 8.484e-05 on 12 degrees of freedom
## Multiple R-squared:  0.09581,    Adjusted R-squared:  0.02046
## F-statistic: 1.272 on 1 and 12 DF,  p-value: 0.2815

# Also not significant.

# % Weight Gain #
full.blk.perc <- lm(df.growth.blk$percent.weight~df.growth.blk$exp.temp + I(df.growth.blk$exp.temp^2)
+ df.growth.blk$start.weight.blk)
summary(full.blk.perc)

##
## Call:
## lm(formula = df.growth.blk$percent.weight ~ df.growth.blk$exp.temp +
##      I(df.growth.blk$exp.temp^2) + df.growth.blk$start.weight.blk)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -8.1225 -1.6184  0.2145  1.4015  6.4150
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)      -21.3483     27.5280  -0.776   0.456
## df.growth.blk$exp.temp      2.4994      3.2762   0.763   0.463
## I(df.growth.blk$exp.temp^2)  -0.1232      0.1020  -1.208   0.255
## df.growth.blk$start.weight.blk  1.0335      3.1743   0.326   0.751
##
## Residual standard error: 4.003 on 10 degrees of freedom
## Multiple R-squared:  0.7433, Adjusted R-squared:  0.6663
## F-statistic: 9.652 on 3 and 10 DF,  p-value: 0.002674

drop1(full.blk.perc)

```



```
## Single term deletions
##
## Model:
## df.growth.blk$percent.weight ~ df.growth.blk$exp.temp + I(df.growth.blk$exp.temp^2) +
##   df.growth.blk$start.weight.blk
##
##           Df Sum of Sq    RSS    AIC
## <none>                160.24 42.127
## df.growth.blk$exp.temp      1     9.3261 169.56 40.919
## I(df.growth.blk$exp.temp^2)  1    23.3900 183.63 42.034
## df.growth.blk$start.weight.blk 1     1.6987 161.94 40.274
```

```
# drop starting weight
drop.start.blk.perc <- lm(df.growth.blk$percent.weight~df.growth.blk$exp.temp +
                          I(df.growth.blk$exp.temp^2))
summary(drop.start.blk.perc)
```

```
##
## Call:
## lm(formula = df.growth.blk$percent.weight ~ df.growth.blk$exp.temp +
##     I(df.growth.blk$exp.temp^2))
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -8.3864 -1.7685  0.0794  2.0400  5.9284
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    -15.94976     21.06247   -0.757    0.465
## df.growth.blk$exp.temp      1.96688     2.72093    0.723    0.485
## I(df.growth.blk$exp.temp^2)  -0.10613     0.08382   -1.266    0.232
##
## Residual standard error: 3.837 on 11 degrees of freedom
## Multiple R-squared:  0.7406, Adjusted R-squared:  0.6934
## F-statistic: 15.7 on 2 and 11 DF,  p-value: 0.0005984
```

```
drop1(drop.start.blk.perc)
```

```
## Single term deletions
##
## Model:
## df.growth.blk$percent.weight ~ df.growth.blk$exp.temp + I(df.growth.blk$exp.temp^2)
##
##           Df Sum of Sq    RSS    AIC
## <none>                161.94 40.274
## df.growth.blk$exp.temp      1     7.6926 169.63 38.924
## I(df.growth.blk$exp.temp^2)  1    23.6027 185.54 40.179
```

```
#drop linear
drop.linear.blk.perc <- lm(df.growth.blk$percent.weight~I(df.growth.blk$exp.temp^2))
summary(drop.linear.blk.perc)
```

```
##
## Call:
```

```
## lm(formula = df.growth.blk$percent.weight ~ I(df.growth.blk$exp.temp^2))
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -7.5822 -2.0208 -0.3466  1.9695  6.5279
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    -0.859578    2.744556  -0.313  0.759510
## I(df.growth.blk$exp.temp^2) -0.045834    0.008082  -5.671  0.000104 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 3.76 on 12 degrees of freedom
## Multiple R-squared:  0.7283, Adjusted R-squared:  0.7056
## F-statistic: 32.16 on 1 and 12 DF,  p-value: 0.0001038
```

#highly significant squared term