

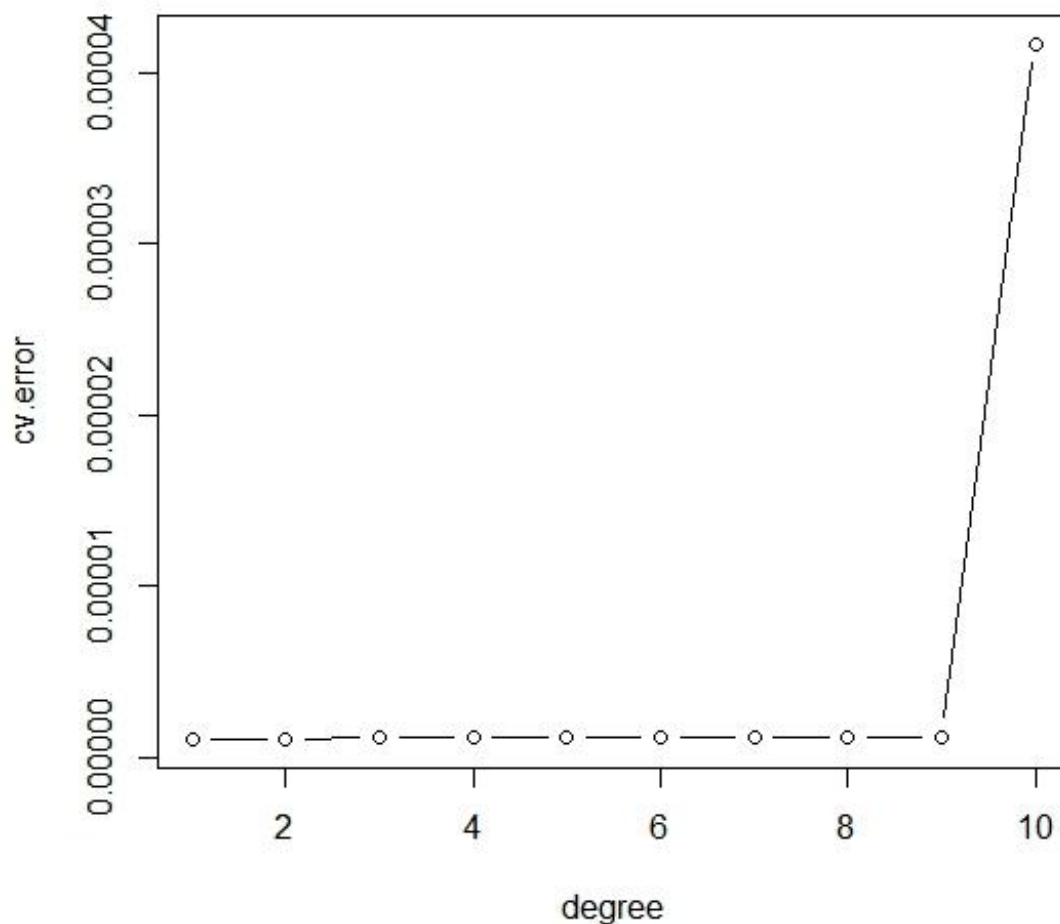
Following from our previous assignment we will now try to estimate the minimum MSE based on the degree of our linear model (For degree 2 to 10, with LOOCV method):

```
library(boot)
set.seed(1994)
cv.error=rep(0,10)
degree=1:10
for (d in degree){
  glm.fit=glm(test$"100regist2013"~poly(test$"100labour2013",d), data=test)
  cv.error[d] = cv.glm(test, glm.fit)$delta[1]
}
```

`cv.error` [1]

0.000001039363
0.000001067604
0.000001128878
0.000001138033
0.000001138054
0.000001161906
0.000001175736
0.000001190911
0.000001195136
0.000041671210

`plot(degree, cv.error, type="b")`



Also we will retrieve the summaries of Linear Models and as well as their plots (1st to 4th degree):

Linear (1st degree)

Call:

```
lm(formula = test$`100regist2013` ~ poly(test$`100labour2013`,  
1))
```

Residuals:

Min	1Q	Median	3Q	Max
-0.080301	-0.045076	-0.007448	0.035815	0.141547

Coefficients:

	Estimate	Std. Error	t value
(Intercept)	0.374262	0.009984	37.486
poly(test\$`100labour2013`, 1)	0.344168	0.056478	6.094
		Pr(> t)	

(Intercept) < 0.0000000000000002 ***

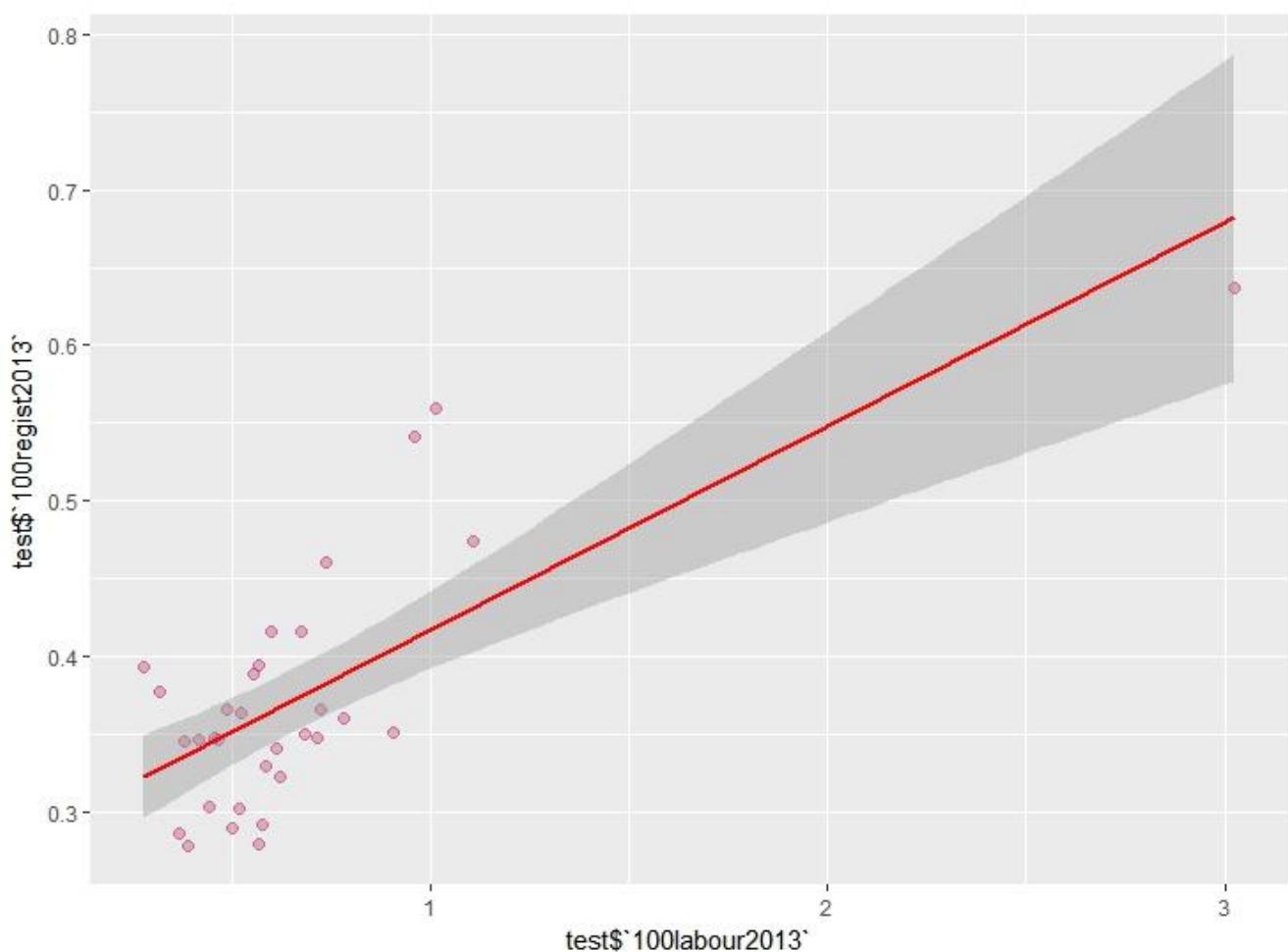
poly(test\$`100labour2013`, 1) 0.00000107 ***

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

Residual standard error: 0.05648 on 30 degrees of freedom

Multiple R-squared: 0.5531, Adjusted R-squared: 0.5382

F-statistic: 37.13 on 1 and 30 DF, p-value: 0.000001073



Quadratic (2nd degree)

Call:

```
lm(formula = test$`100regist2013` ~ poly(test$`100labour2013`,  
2))
```

Residuals:

Min	1Q	Median	3Q	Max
-0.08059	-0.04251	0.00083	0.03162	0.11089

Coefficients:

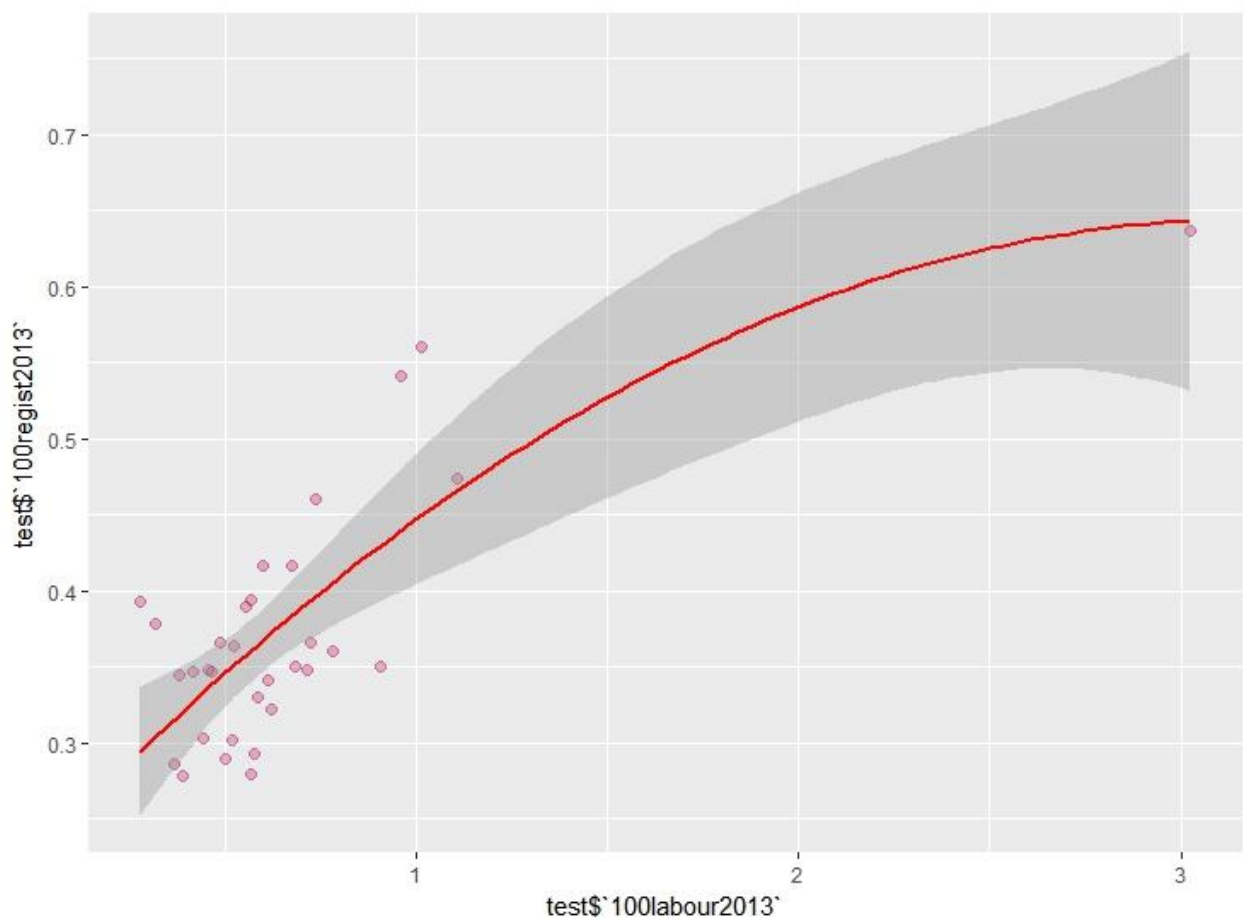
	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	0.374262	0.009663	38.730	< 0.0000000000000002 ***
poly(test\$`100labour2013`, 2)1	0.344168	0.054664	6.296	0.000000709 ***
poly(test\$`100labour2013`, 2)2	-0.095063	0.054664	-1.739	0.0926 .

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

Residual standard error: 0.05466 on 29 degrees of freedom

Multiple R-squared: 0.5953, Adjusted R-squared: 0.5674

F-statistic: 21.33 on 2 and 29 DF, p-value: 0.000002008



Qubic (3rd degree)

Call:

```
lm(formula = test$`100regist2013` ~ poly(test$`100labour2013`,  
3))
```

Residuals:

Min	1Q	Median	3Q	Max
-0.090959	-0.033512	-0.004153	0.034715	0.079960

Coefficients:

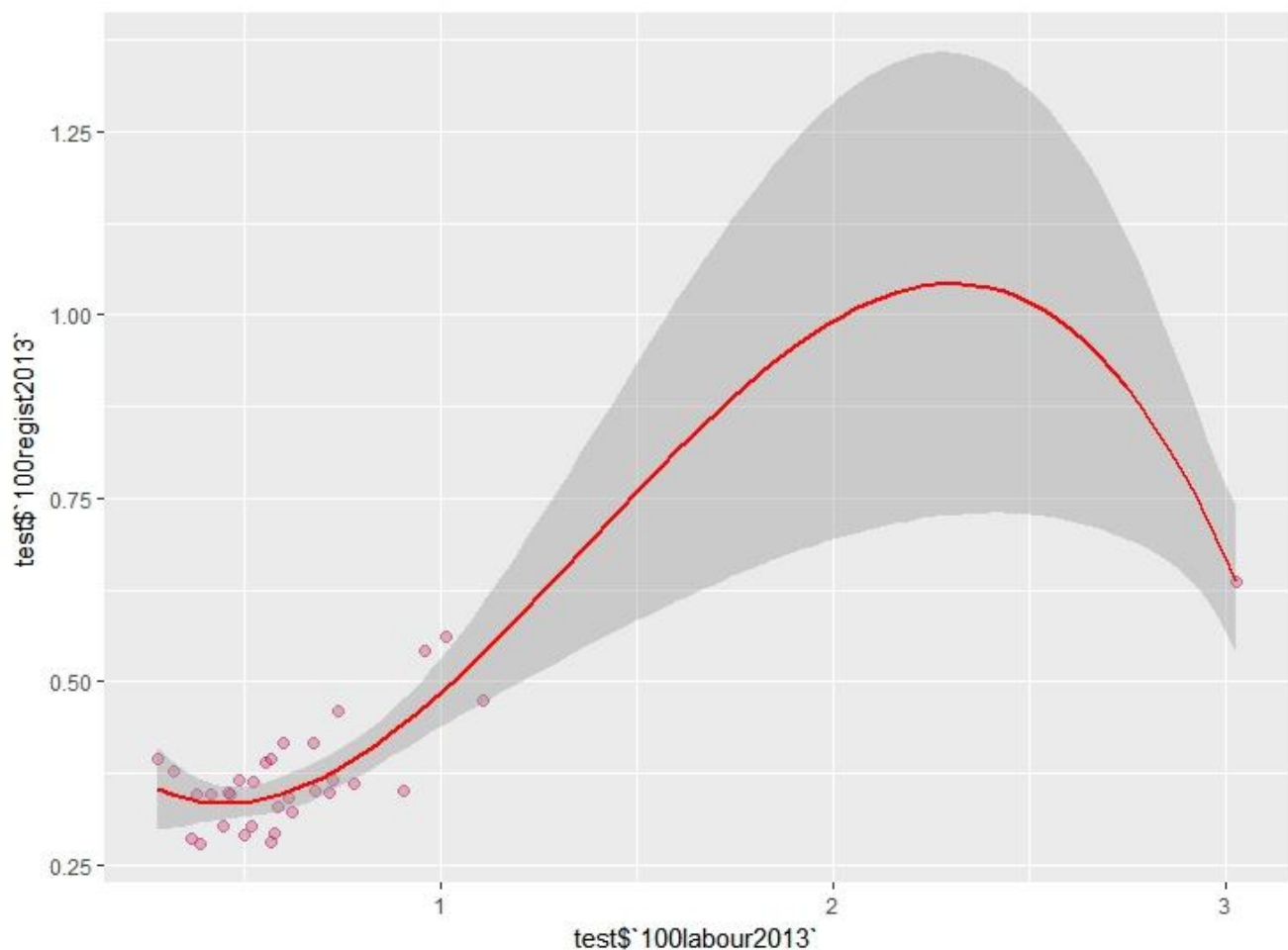
	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	0.37426	0.00865	43.265	< 0.0000000000000002 ***
poly(test\$`100labour2013`, 3)1	0.34417	0.04893	7.033	0.000000119 ***
poly(test\$`100labour2013`, 3)2	-0.09506	0.04893	-1.943	0.06217 .
poly(test\$`100labour2013`, 3)3	-0.14003	0.04893	-2.862	0.00789 **

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

Residual standard error: 0.04893 on 28 degrees of freedom

Multiple R-squared: 0.6869, Adjusted R-squared: 0.6534

F-statistic: 20.48 on 3 and 28 DF, p-value: 0.0000003172



Quartic (4th degree)

Call:

```
lm(formula = test$`100regist2013` ~ poly(test$`100labour2013`,  
4))
```

Residuals:

Min	1Q	Median	3Q	Max
-0.105093	-0.035615	-0.004116	0.034964	0.071204

Coefficients:

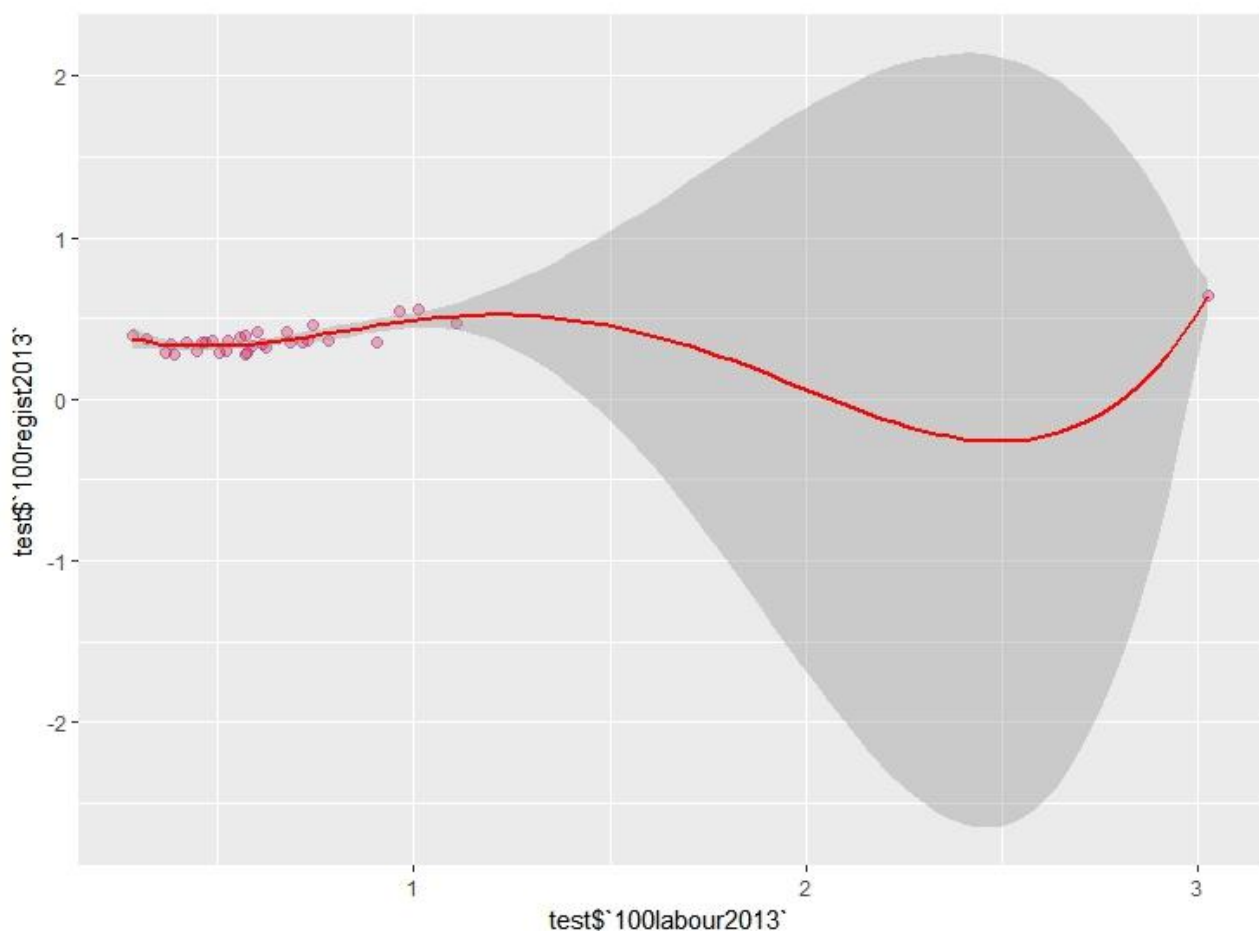
	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	0.374262	0.008615	43.445	< 0.0000000000000002 ***
poly(test\$`100labour2013`, 4)1	0.344168	0.048732	7.063	0.000000136 ***
poly(test\$`100labour2013`, 4)2	-0.095063	0.048732	-1.951	0.06154 .
poly(test\$`100labour2013`, 4)3	-0.140028	0.048732	-2.873	0.00782 **
poly(test\$`100labour2013`, 4)4	0.054125	0.048732	1.111	0.27650

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

Residual standard error: 0.04873 on 27 degrees of freedom

Multiple R-squared: 0.7006, Adjusted R-squared: 0.6562

F-statistic: 15.79 on 4 and 27 DF, p-value: 0.0000008896



Findings

From the estimations of MSEs for different polynomial degrees, we can understand that our scenario can be best described with the use of a linear model (1st degree). Because of insufficient number of observations, but also because of an extreme value (that one that has as labour ratio ~ 3.0), any higher polynomial is not more accurate and seems that cannot offer any safer prediction.

It is recommended to have more observations in order to eliminate the problems that we have encountered because of the extreme value.

All in all, the MSE seems to be almost the same until the 9th polynomial degree.