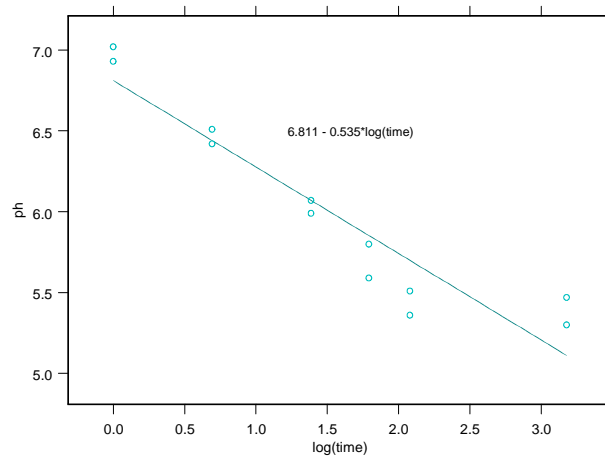


## Assessing Model Fit

### Continuation of Meat Processing Example: Ex 8.16

Same data as we analyzed previously plus 2 additional measurements taken at 24 hours.  
Scatterplot plus OLS regression line using  $\log(\text{time})$  as X and pH as Y.



Is the model OK? Can we proceed with confidence intervals and prediction intervals?

#### S-PLUS OUTPUT:

```
Call: lm(formula = ph ~ log.time, data = Ex0816, na.action = na.omit)
```

Residuals:

Min	1Q	Median	3Q	Max
-0.3389731	-0.1070994	-0.0102258	0.1360878	0.3587868

Coefficients:

	Value	Std. Error	t value	Pr(> t )
(Intercept)	6.8114785	0.1112888	61.2054319	0.0000000
log.time	-0.5350021	0.0608994	-8.7850099	0.0000051

Residual standard error: 0.2135464 on 10 degrees of freedom

Multiple R-Squared: 0.8852901

F-statistic: 77.1764 on 1 and 10 degrees of freedom,  
the p-value is 5.140138e-006

Analysis of Variance Table

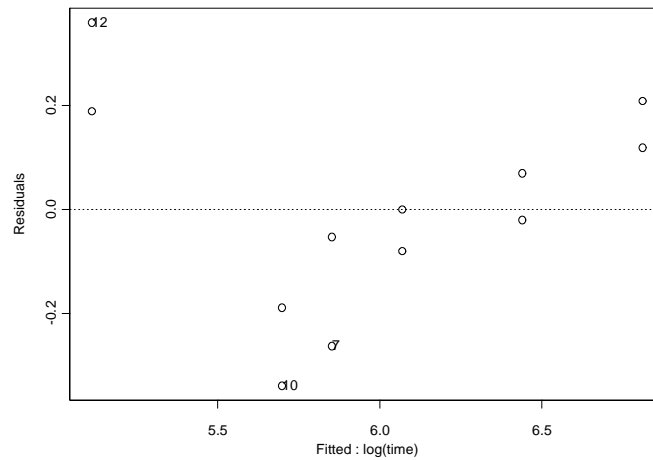
Response: ph

Terms added sequentially (first to last)

	Df	Sum of Sq	Mean Sq	F Value	Pr(F)
log.time	1	3.519404215	3.519404215	77.17639914	5.140137971e-006
Residuals	10	0.456020785	0.045602079		

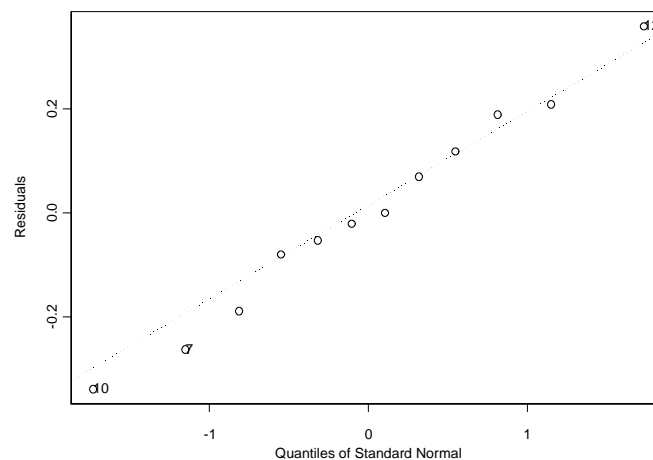
Does the straight line model fit the data? We can't tell if the model is appropriate based on the above output.

The most useful tool is a plot of residuals versus fitted values



Lack of fit more obvious here!

Normal quantiles versus quantiles of residuals does not look too bad. Normality assumption is required for testing hypotheses and forming Confidence and Prediction intervals. Because of the lack of fit above, no sense worrying about the normality assumption just yet.



Because we have replicate observations, we can conduct a lack of fit test to see if there is significant lack of fit.

To do this we need to get the ANOVA table for a 1-way Analysis of variance in addition to the ANOVA table from the regression output. See the lab web page for HW 2 on how to fit the AOV model.

\*\*\* Analysis of Variance Model \*\*\*

Call:

```
aov(formula = ph ~ as.factor(log.time), data = Ex0816, na.action = na.omit)
```

Terms:

```
              as.factor(log.time) Residuals
Sum of Squares              3.916375  0.059050
Deg. of Freedom              5          6
```

Residual standard error: 0.0992051746

Estimated effects are balanced

```
              Df Sum of Sq      Mean Sq    F Value    Pr(F)
as.factor(log.time)  5   3.916375  0.7832750000  79.5876376 0.00002114860428
Residuals          6   0.059050  0.0098416667
```

Construct the ANOVA table for the Lack of Fit test.

<i>Source</i>	<i>df</i>	<i>Sum of Squares</i>	<i>Mean Square</i>	<i>F</i>	<i>Pr(F)</i> ( <i>p-value</i> )
Regression <sup>1</sup>					
Residual <sup>2</sup> :					
Lack of Fit <sup>3</sup>					
Pure Error <sup>4</sup>					

---

1 From the Regression ANOVA table line (listed as log.time here)

2 From the Regression ANOVA table residual line

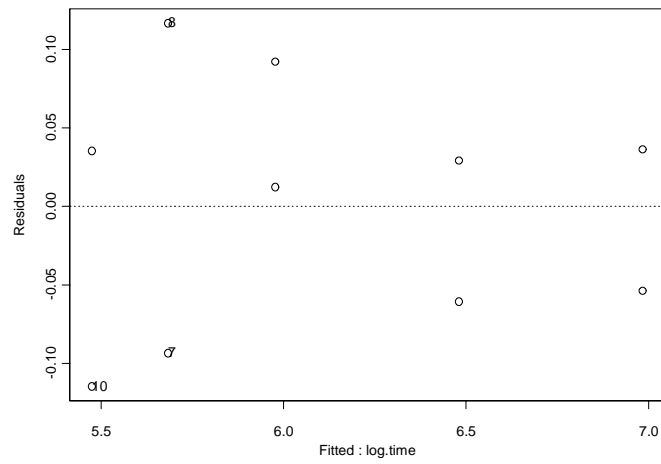
3 Lack of Fit df and SS are obtained by subtracting Pure Error from the Residual line

4 Pure error df and SS comes from the Residual line of the 1-way AOV model (called "Within Groups" in the text.

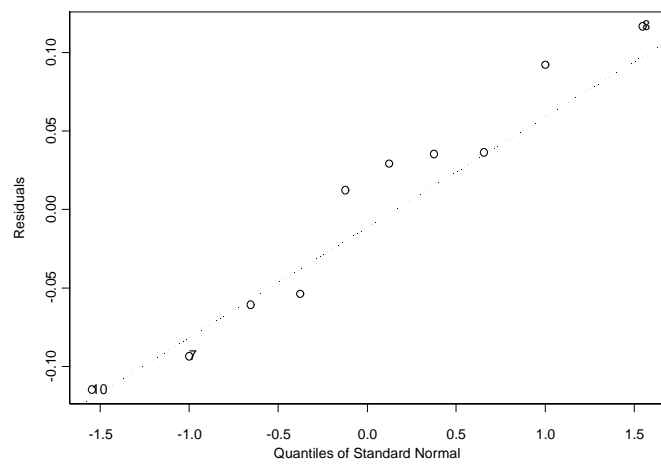
Conclusion?

Go back to model without the last 24 hour data and check fit.

Without the last 24 hour data: residual vs fitted values look ok



Normal quantile-quantile plots: OK



## Summaries without the 24 hour data

(Note to fit the model using a subset of observations 1:10 set subset to 1:10 in the regression dialog)

\*\*\* Linear Model \*\*\*

Analysis of Variance Table

Terms added sequentially (first to last)

	Df	Sum of Sq	Mean Sq	F Value	Pr(F)
log.time	1	3.006466745	3.006466745	444.3060709	2.695158219e-008
Residuals	8	0.054133255	0.006766657		

\*\*\* One Anova Model \*\*\*

	Df	Sum of Sq	Mean Sq	F Value	Pr(F)
as.factor(log.time)	4	3.0160	0.75400	84.52914798	0.00008878601939
Residuals	5	0.0446	0.00892		

Construct the ANOVA table for the Lack of Fit test for subset.

<i>Source</i>	<i>df</i>	<i>Sum of Squares</i>	<i>Mean Square</i>	<i>F</i>	<i>Pr(F)</i> <i>(p-value)</i>
Regression <sup>5</sup>					
Residual <sup>6</sup> :					
Lack of Fit <sup>7</sup>					
Pure Error <sup>8</sup>					

## Conclusions?

---

5 From the Regression ANOVA table line (listed as log.time here)

6 From the Regression ANOVA table residual line

7 Lack of Fit df and SS are obtained by subtracting Pure Error from the Residual line

8 Pure error df and SS comes from the Residual line of the 1-way AOV model (called "Within Groups" in the text.