

```
## Loading required package: ggplot2
## Warning: package 'ggplot2' was built under R version 3.1.2
## Loading required package: reshape2
## Warning: package 'reshape2' was built under R version 3.1.2
## Loading required package: ROCR
## Warning: package 'ROCR' was built under R version 3.1.2
## Loading required package: gplots
## Warning: package 'gplots' was built under R version 3.1.2
## KernSmooth 2.23 loaded
## Copyright M. P. Wand 1997-2009
##
## Attaching package: 'gplots'
##
## Następujący obiekt został zakryty z 'package:stats':
##
##     lowess
##
## Loading required package: xtable
## Warning: package 'xtable' was built under R version 3.1.2
```

# Github frameworks - data analysis

WikiTeams.pl

28 December 2014 - 7 January 2015

```
options("warn" = -1)
```

## 1 Read in the data

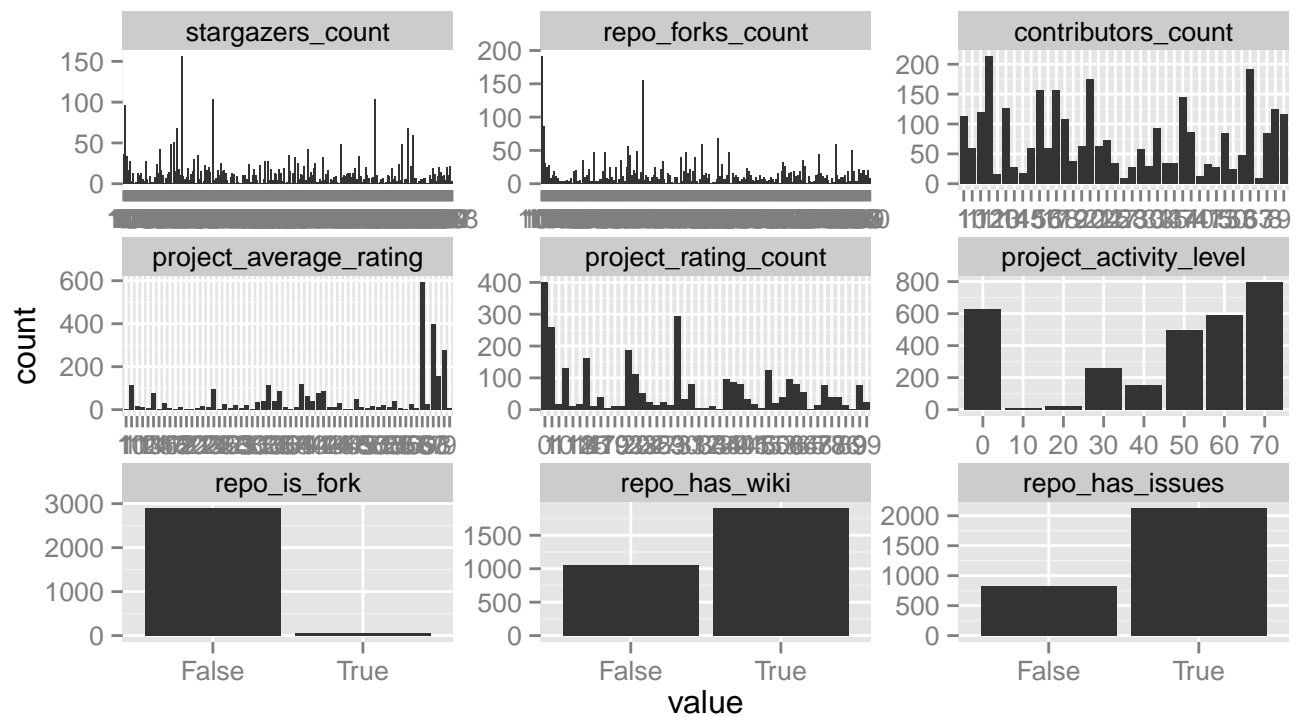
```
D <- read.table("../results.csv", sep=";", quote = "\"", header=T)
names(D)

## [1] "ordinal_id"           "github_repo_id"
## [3] "repo_full_name"       "repo_html_url"
## [5] "repo_forks_count"     "stargazers_count"
## [7] "contributors_count"   "repo_created_at"
## [9] "repo_is_fork"         "repo_has_issues"
## [11] "repo_open_issues_count" "repo_has_wiki"
## [13] "repo_network_count"   "repo_pushed_at"
## [15] "repo_size"            "repo_updated_at"
## [17] "repo_watchers_count"  "project_id"
## [19] "project_name"         "project_url"
## [21] "project_htmlurl"      "project_created_at"
## [23] "project_updated_at"   "project_homepage_url"
## [25] "project_average_rating" "project_rating_count"
## [27] "project_review_count" "project_activity_level"
## [29] "project_user_count"   "twelve_month_contributor_count"
## [31] "total_contributor_count" "twelve_month_commit_count"
## [33] "total_commit_count"   "total_code_lines"
## [35] "main_language_name"   "developer_works_during_bd"
## [37] "developer_works_period" "developer_all_pushes"
## [39] "developer_all_stars_given" "developer_all_creations"
## [41] "developer_all_issues_created" "developer_all_pull_requests"

D$repo_created_at <- as.Date(D$repo_created_at)
D$repo_pushed_at <- as.Date(D$repo_pushed_at)
# convert some factors to numeric for easier computations
D$project_average_rating <- as.numeric(D$project_average_rating)
D$project_rating_count <- as.numeric(D$project_rating_count)
D$project_activity_level <- as.numeric(D$project_activity_level)
#D$repository_has_downloads <- as.numeric(D$repository_has_downloads)
```

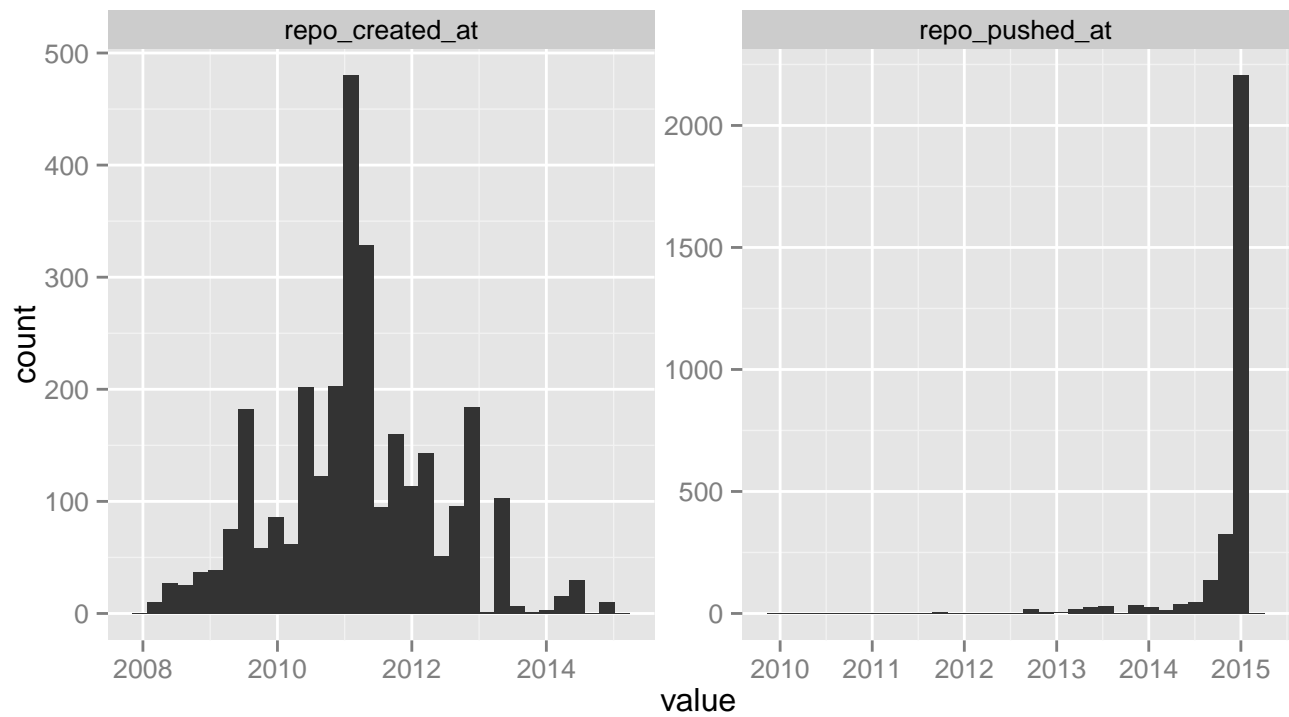
Read 2952 records.

```
# discrete
plot_mhist(D, attrs=c("stargazers_count", "repo_forks_count", "contributors_count", "project_average_rating",
```



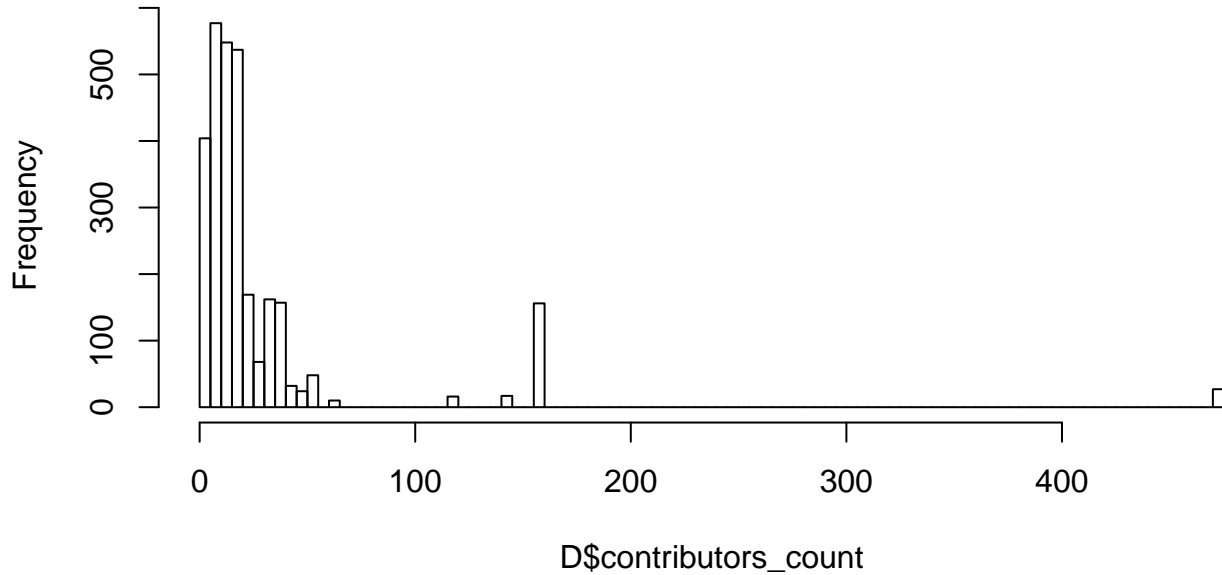
```
# continuous
plot_mhist(D, attrs=c("repo_created_at", "repo_pushed_at"), date.values = T)

## stat_bin: binwidth defaulted to range/30. Use 'binwidth = x' to adjust this.
## stat_bin: binwidth defaulted to range/30. Use 'binwidth = x' to adjust this.
```



```
# contrib count
hist(D$contributors_count, breaks=100)
```

### Histogram of D\$contributors\_count

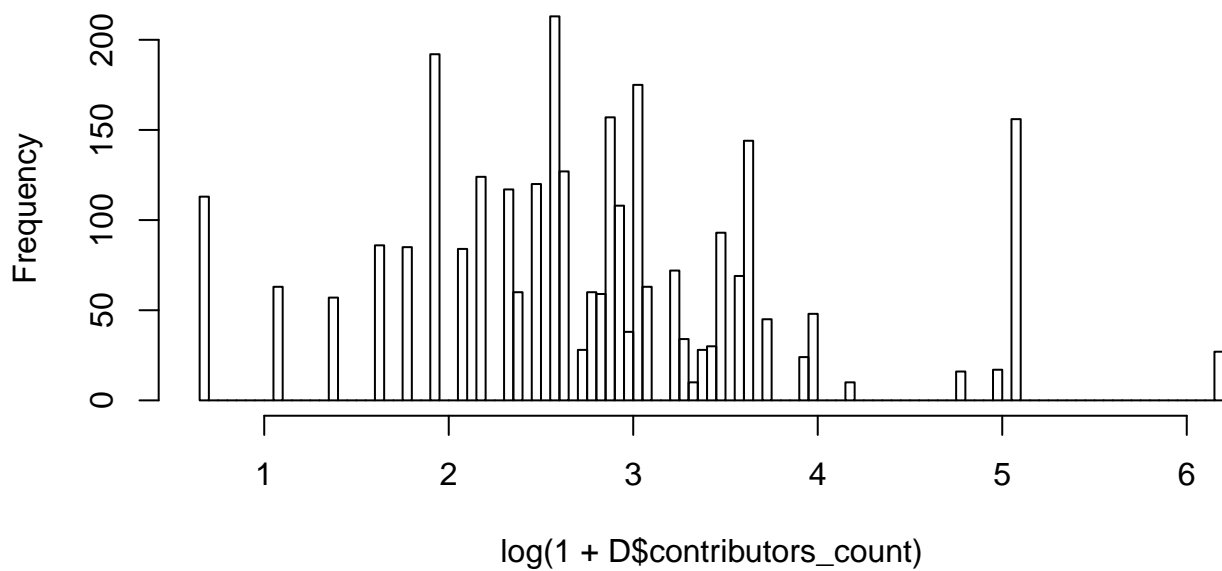


```
summary(D$contributors_count, breaks=100)
```

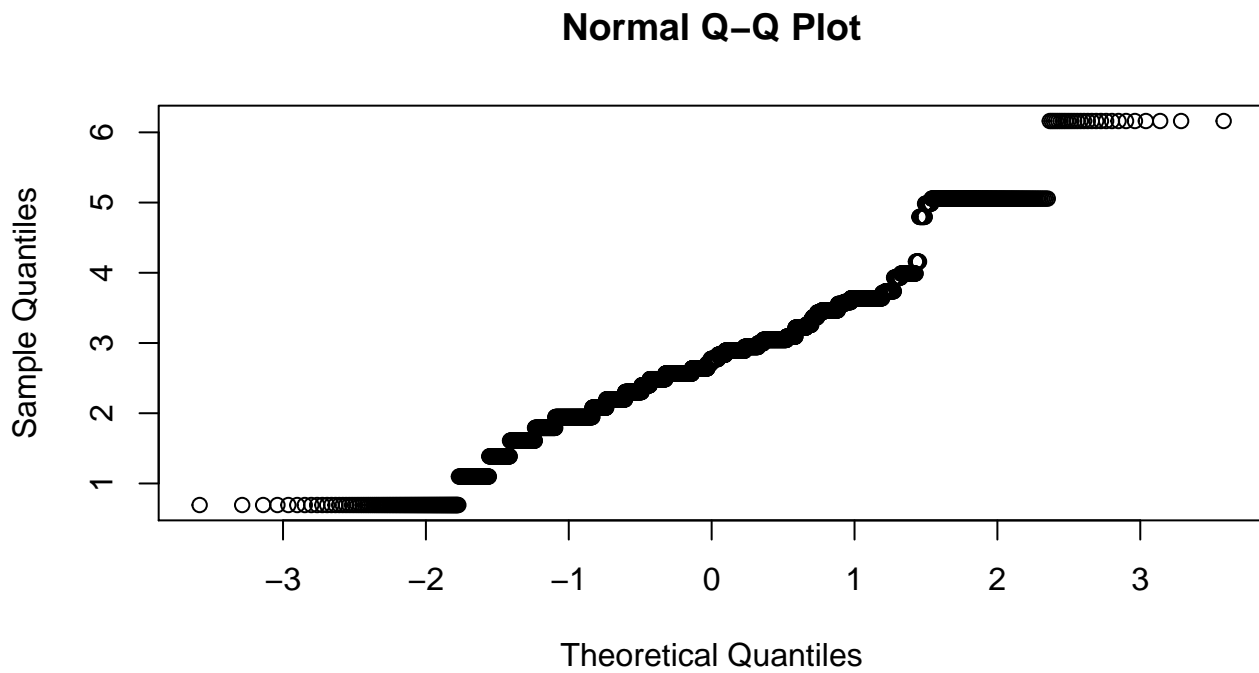
```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.   \n##      1.00   8.00   15.00   29.24  25.00  473.00
```

```
hist(log(1+D$contributors_count), breaks=100)
```

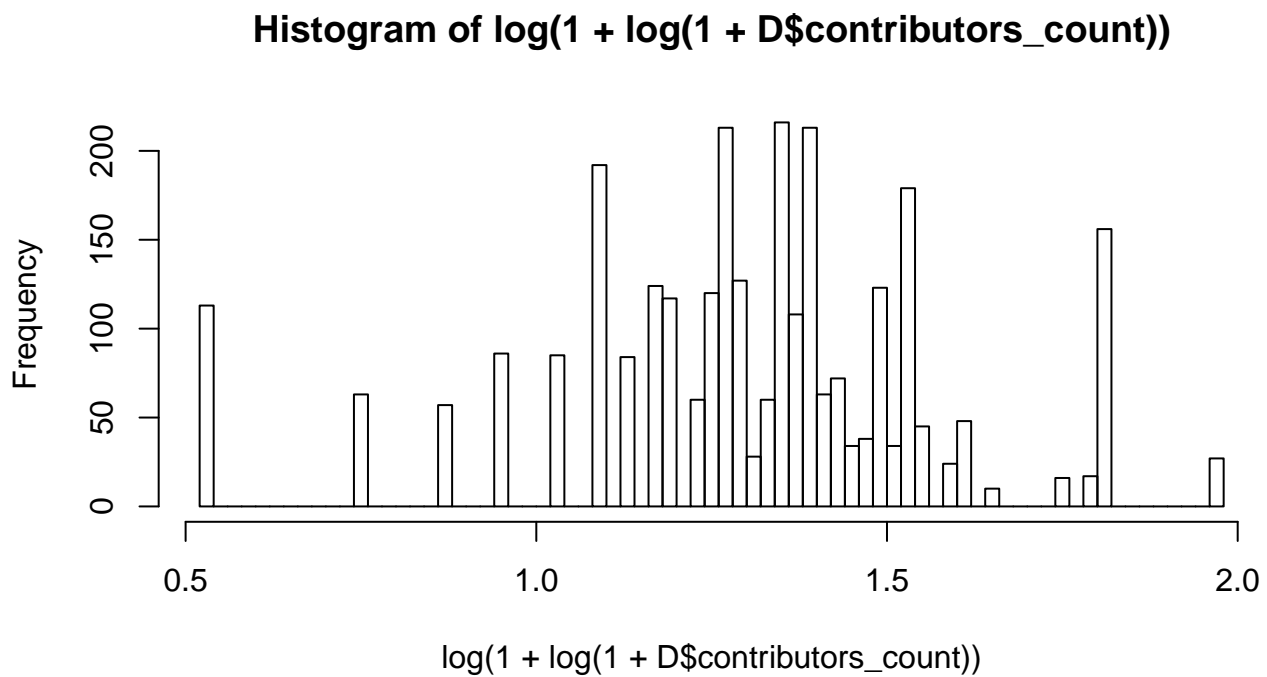
### Histogram of log(1 + D\$contributors\_count)



```
qqnorm(log(1+D$contributors_count))
```

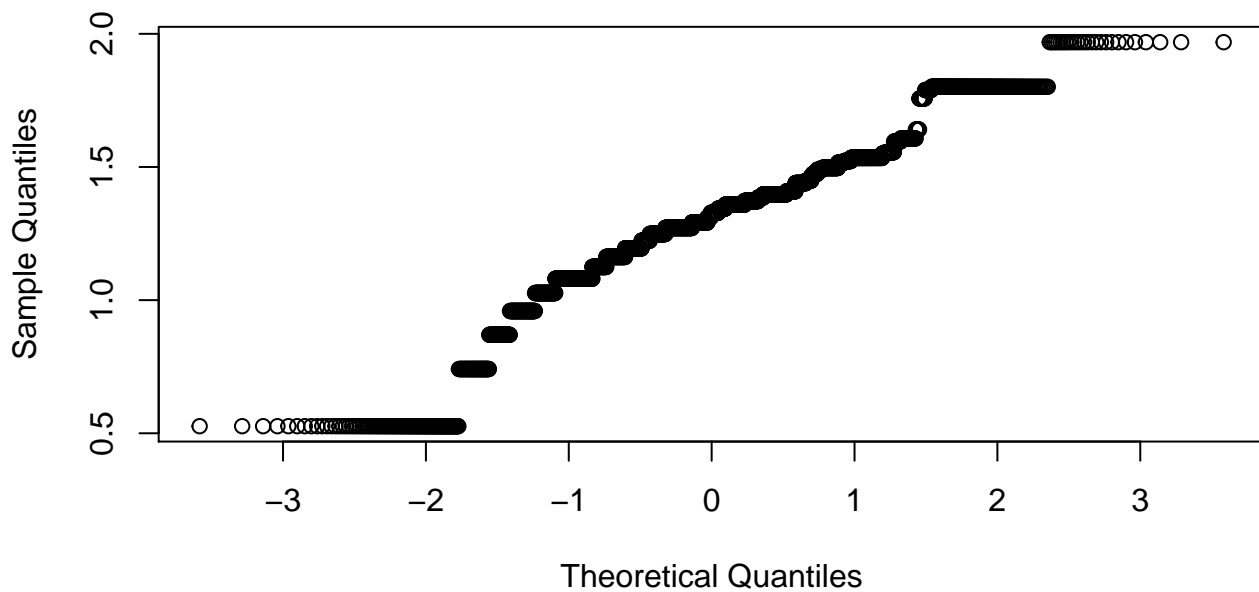


```
hist(log(1+log(1+D$contributors_count)), breaks=100)
```



```
qqnorm(log(1+log(1+D$contributors_count)))
```

### Normal Q-Q Plot

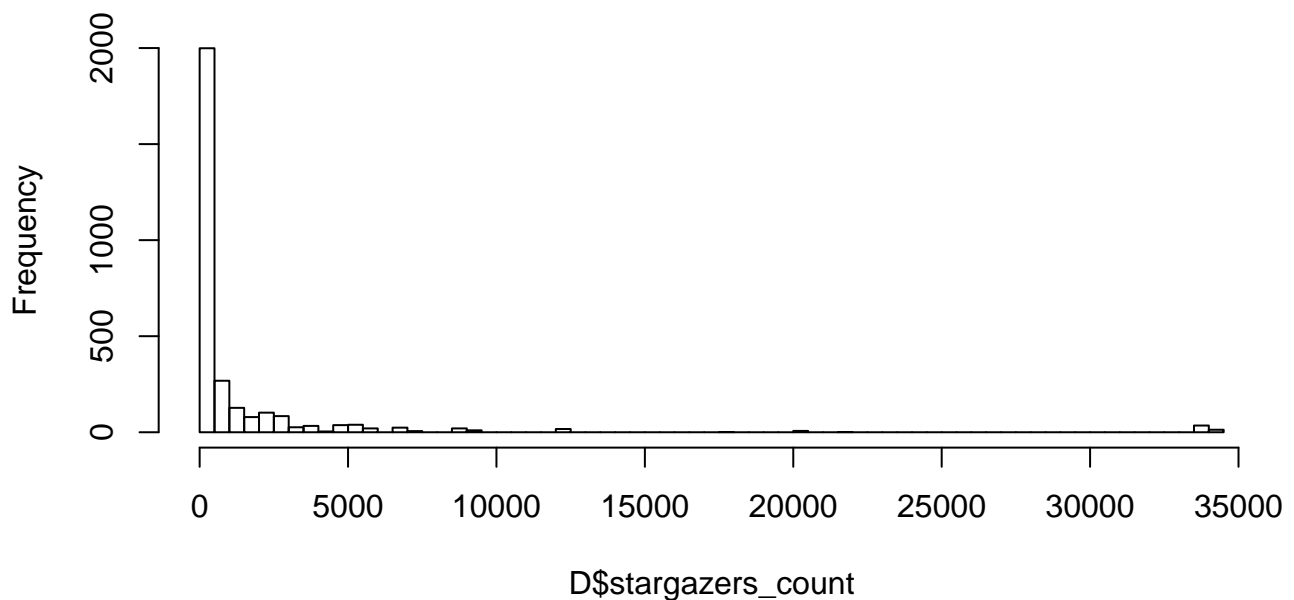


```
summary(log(1+D$contributors_count), breaks=100)

##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##  0.6931  2.1970  2.7730  2.7880  3.2580  6.1610

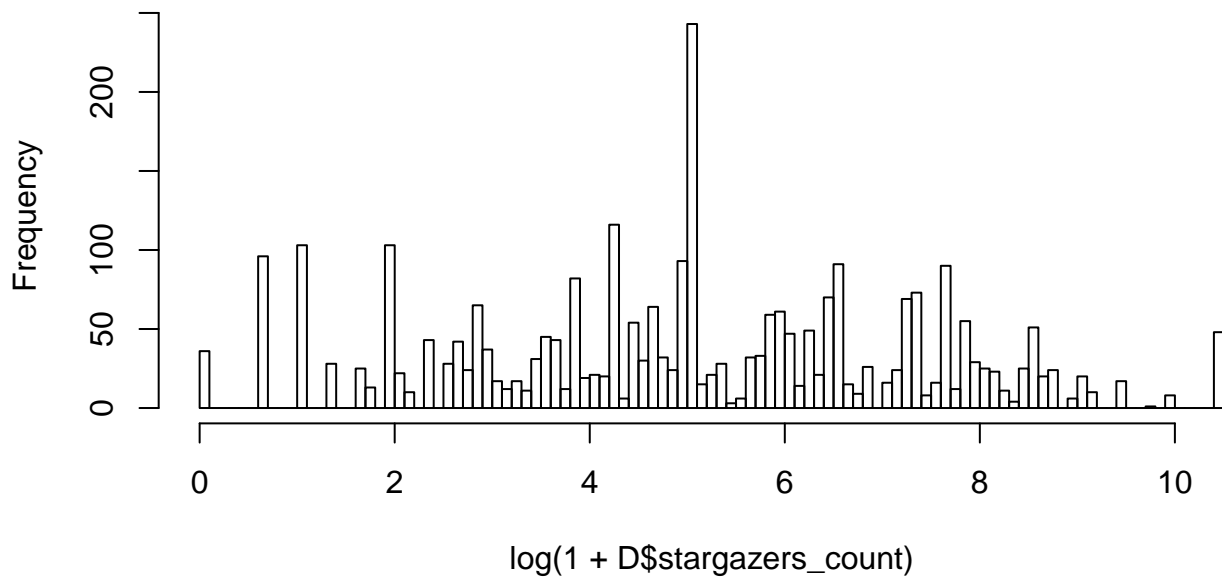
# stargazers count
hist(D$stargazers_count, breaks=100)
```

### Histogram of D\$stargazers\_count



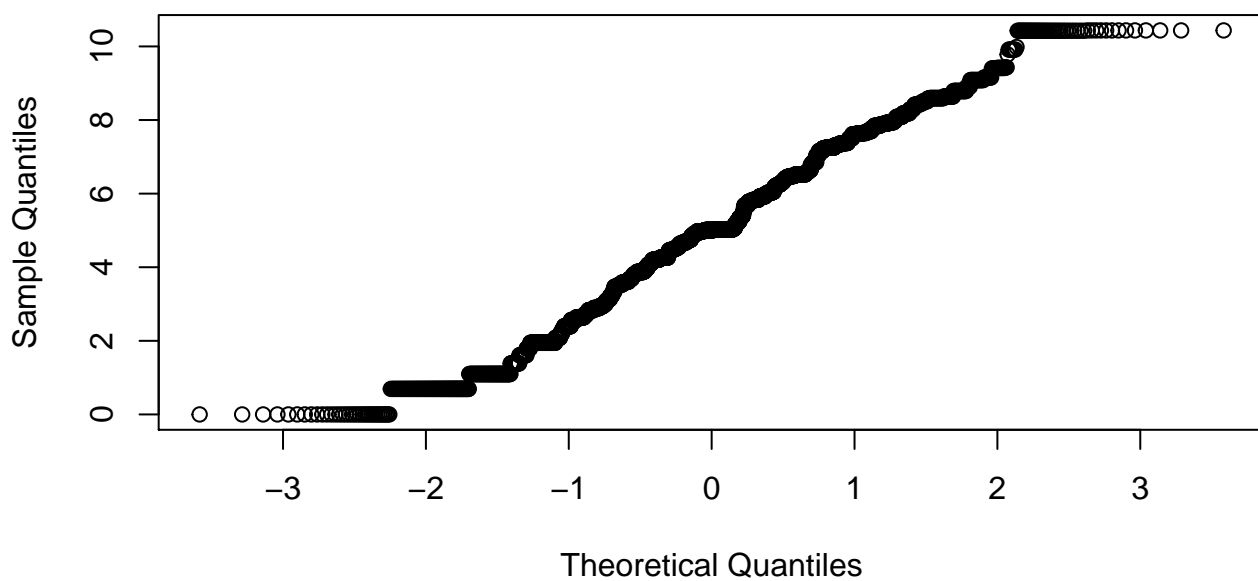
```
hist(log(1+D$stargazers_count), breaks=100)
```

**Histogram of  $\log(1 + D\$stargazers\_count)$**



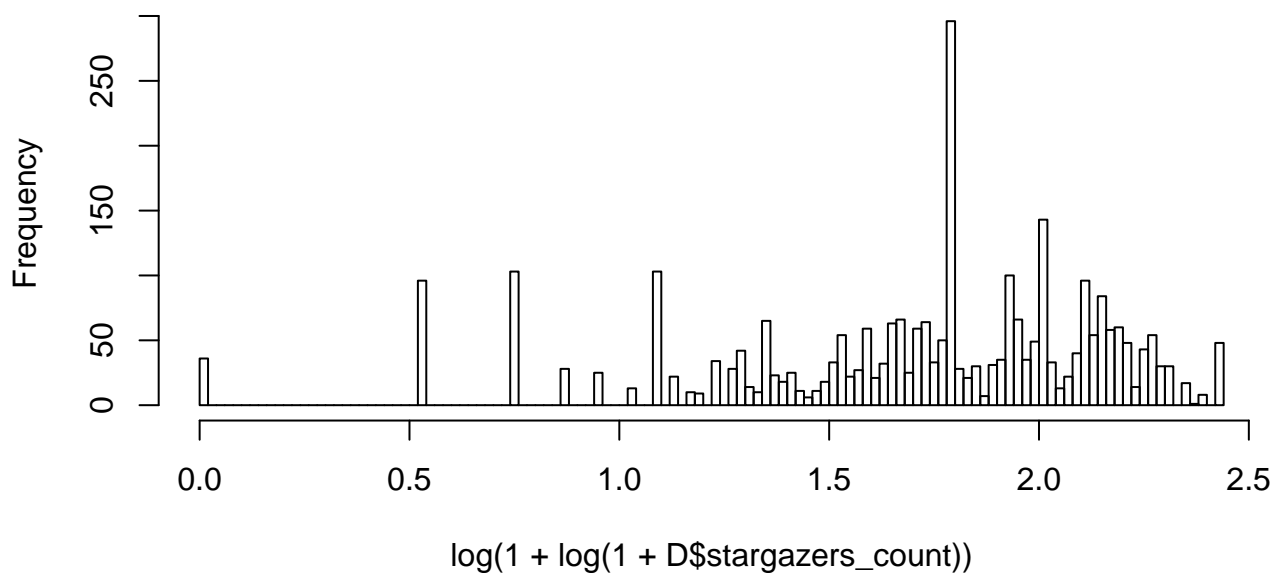
```
qqnorm(log(1+D$stargazers_count))
```

**Normal Q–Q Plot**



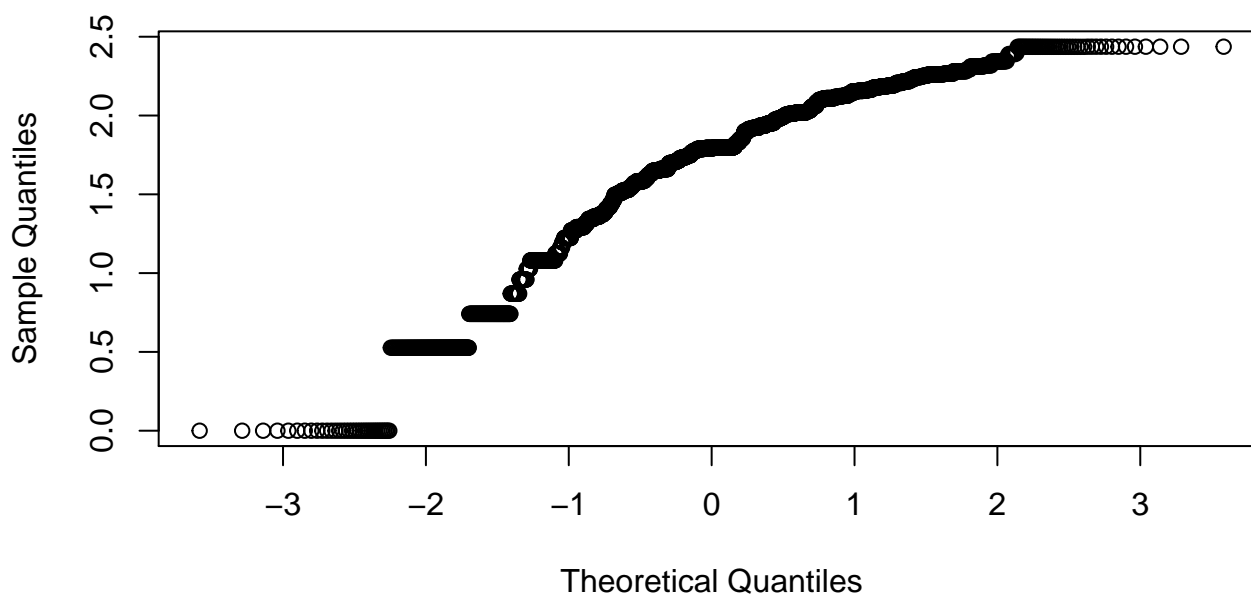
```
hist(log(1+log(1+D$stargazers_count)), breaks=100)
```

### Histogram of $\log(1 + \log(1 + D\$stargazers\_count))$



```
qqnorm(log(1+log(1+D$stargazers_count)))
```

### Normal Q–Q Plot



```
summary(D$stargazers_count)
```

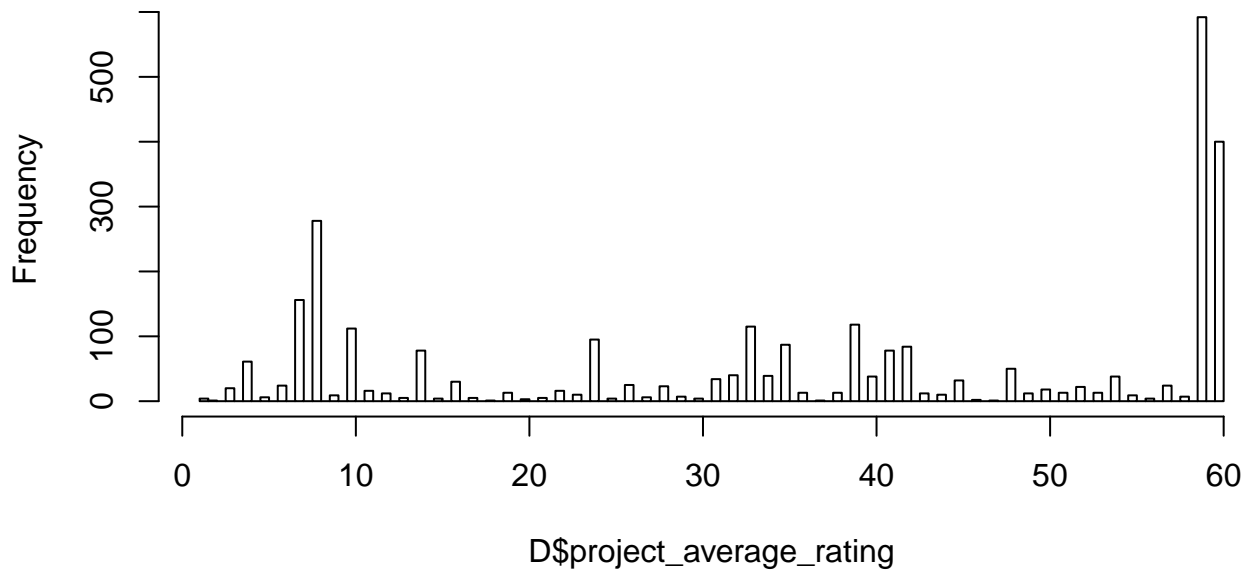
```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##      0.0   31.0   149.0  1471.0  727.8 34030.0
```

```
# openhub rating
```

```
hist(D$project_average_rating, breaks=100)
```

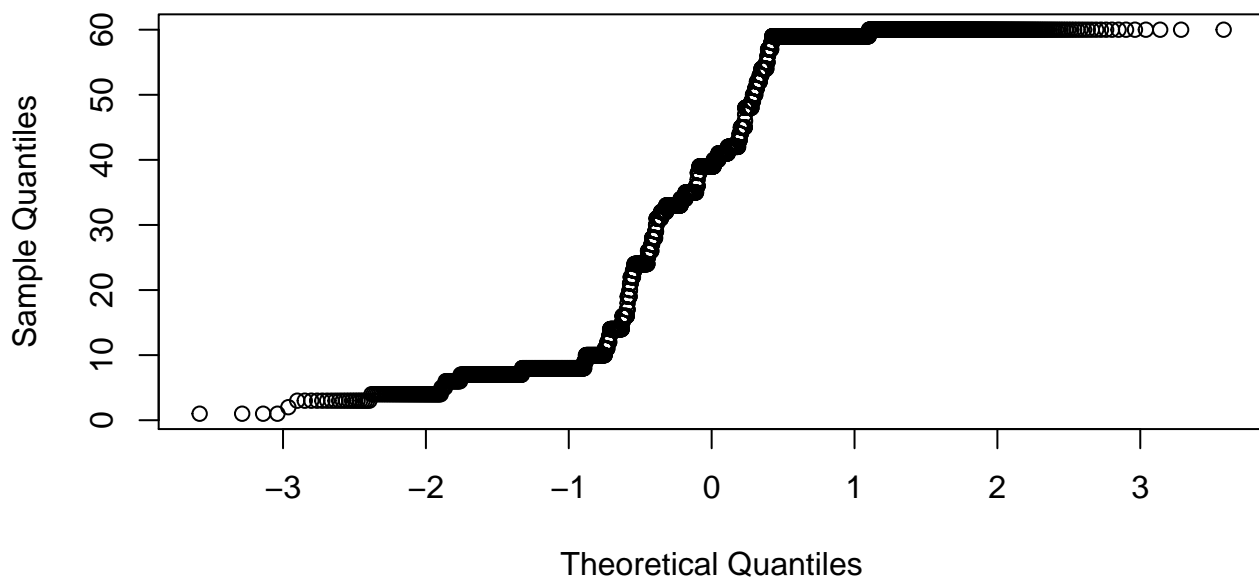


### Histogram of D\$project\_average\_rating



```
qqnorm(D$project_average_rating)
```

### Normal Q-Q Plot



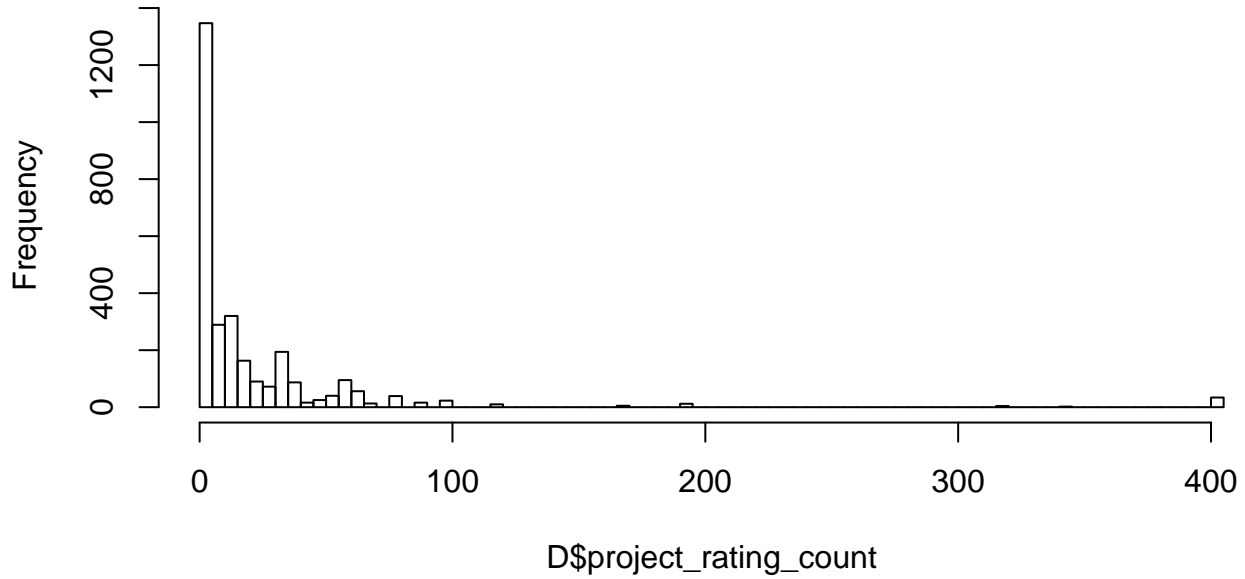
```
summary(D$project_average_rating)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##      1.00   14.00   39.00   36.93   59.00   60.00
```

```
# openhub rating count
```

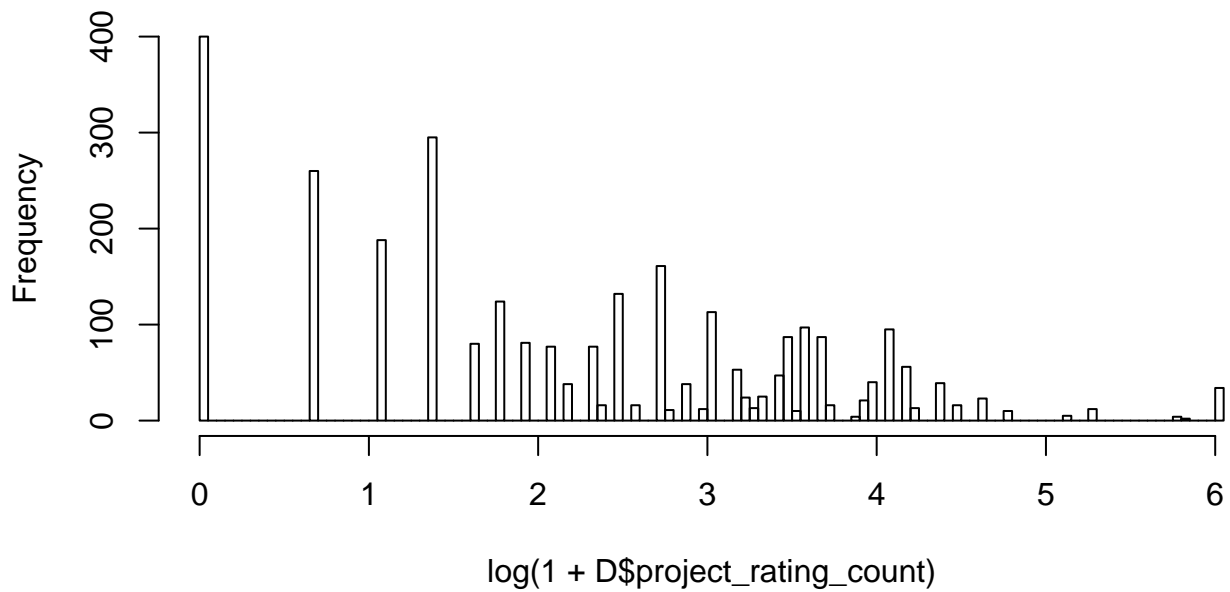
```
hist(D$project_rating_count, breaks=100)
```

**Histogram of D\$project\_rating\_count**



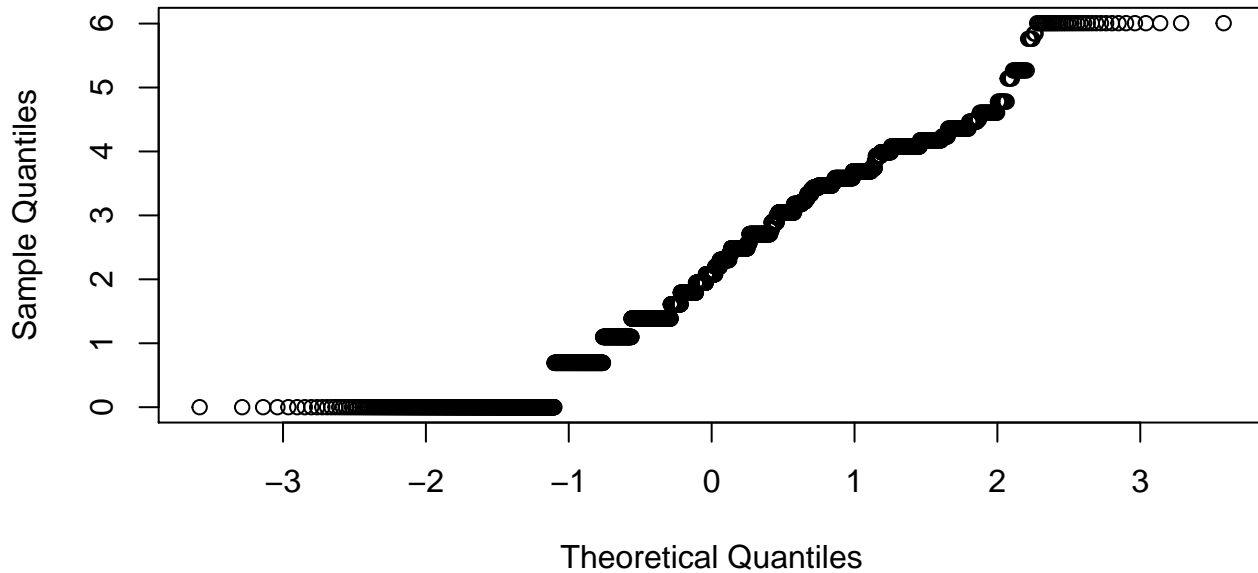
```
hist(log(1+D$project_rating_count), breaks=100)
```

**Histogram of  $\log(1 + \text{D\$project\_rating\_count})$**



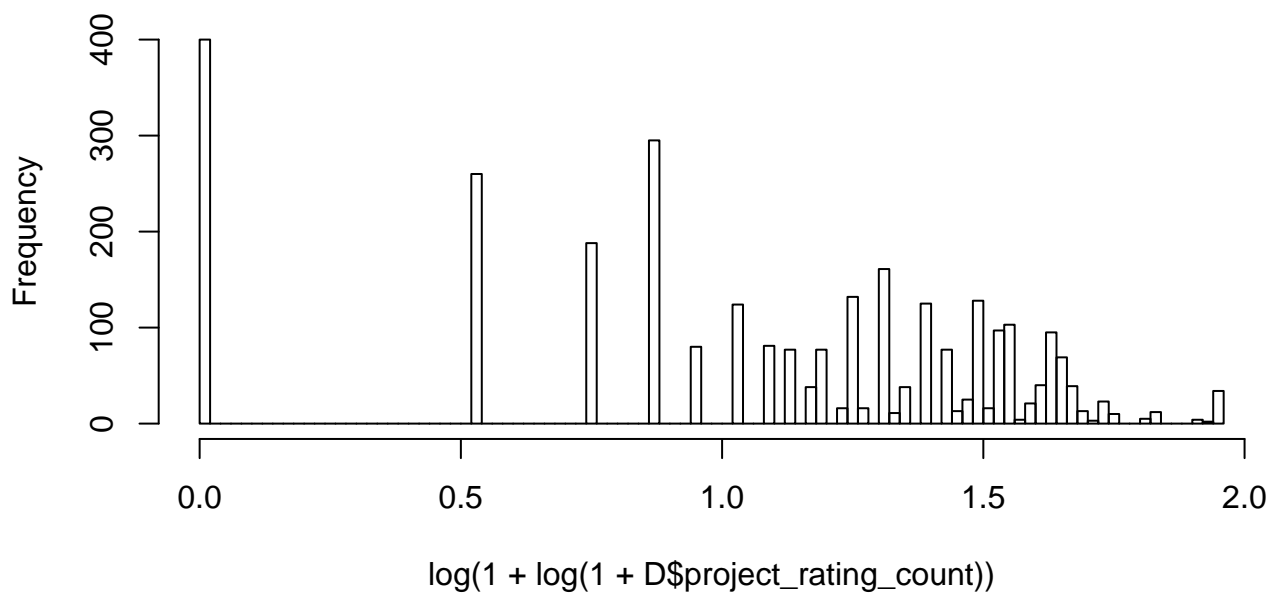
```
qqnorm(log(1+D$project_rating_count))
```

Normal Q-Q Plot



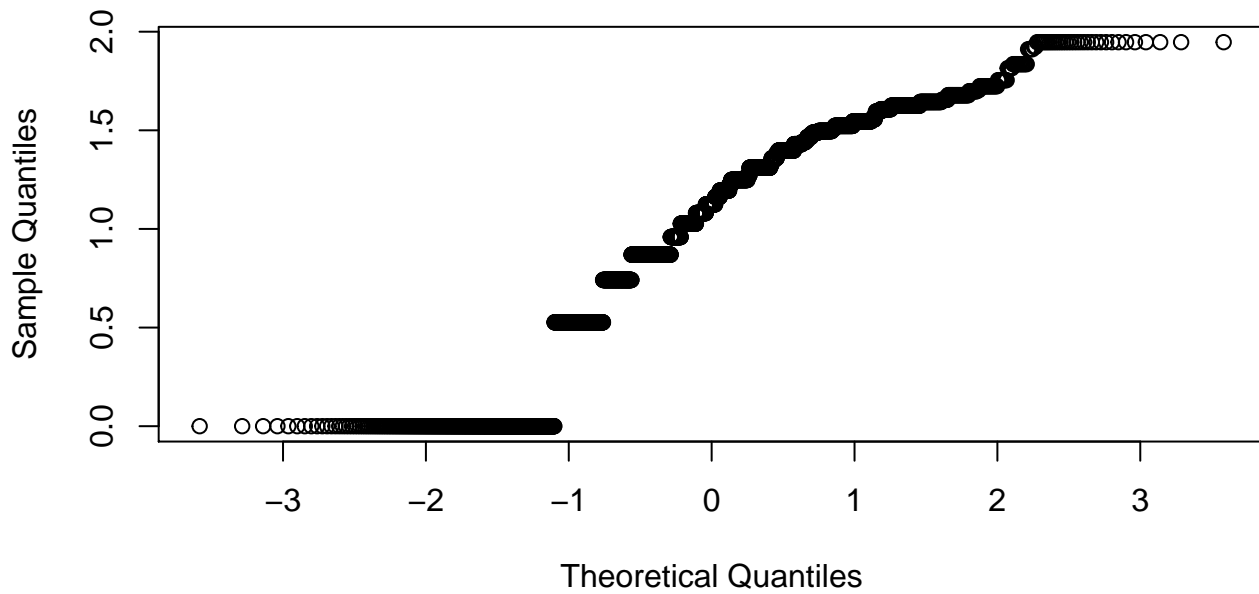
```
hist(log(1+log(1+D$project_rating_count)), breaks=100)
```

Histogram of  $\log(1 + \log(1 + D\$project\_rating\_count))$



```
qqnorm(log(1+log(1+D$project_rating_count)))
```

### Normal Q-Q Plot



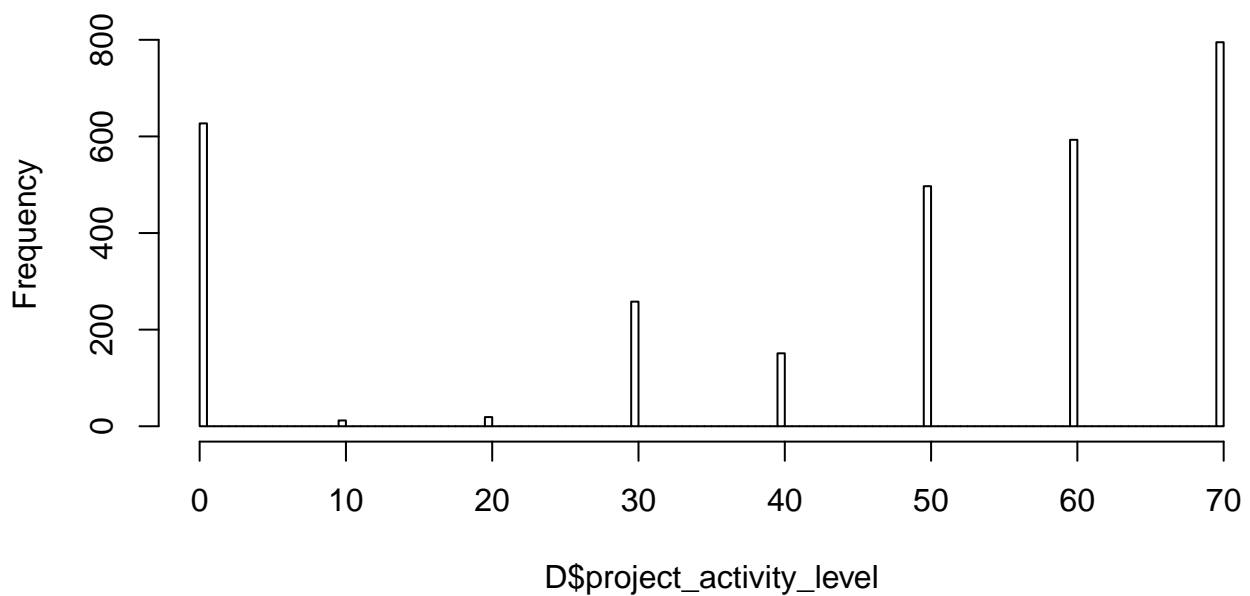
```
summary(D$project_rating_count)
```

```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##      0.00   2.00   7.00   22.55  27.00  405.00
```

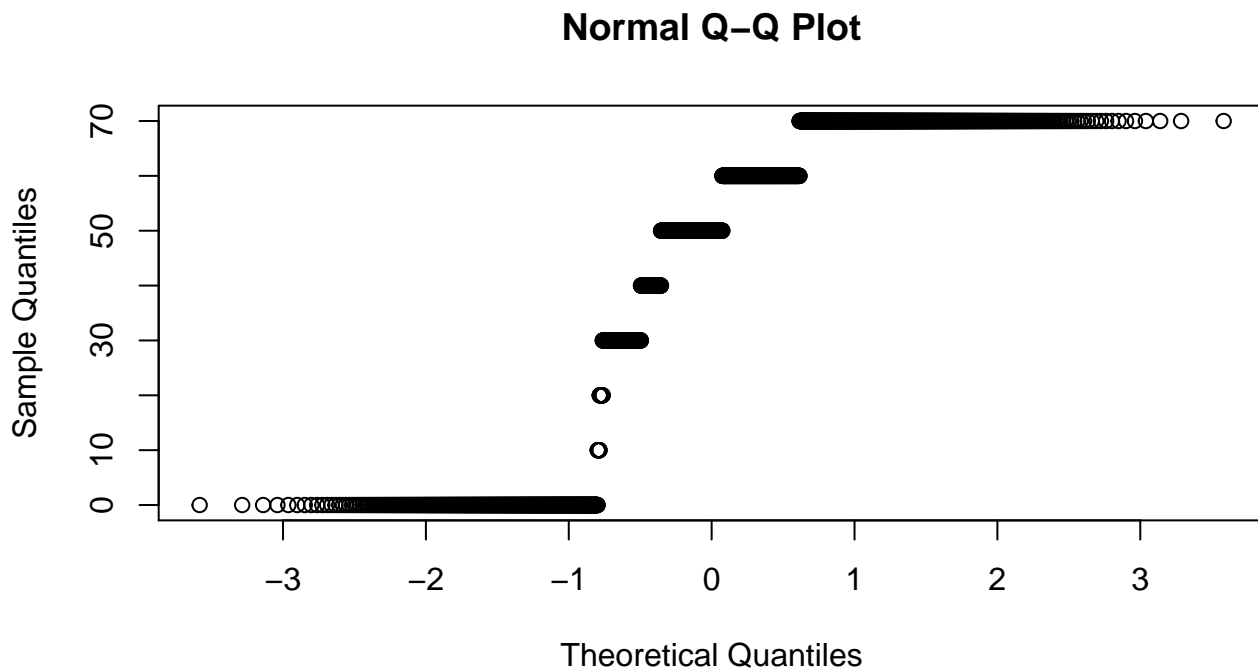
```
# openhub activity level
```

```
hist(D$project_activity_level, breaks=100)
```

### Histogram of D\$project\_activity\_level



```
qqnorm(D$project_activity_level)
```

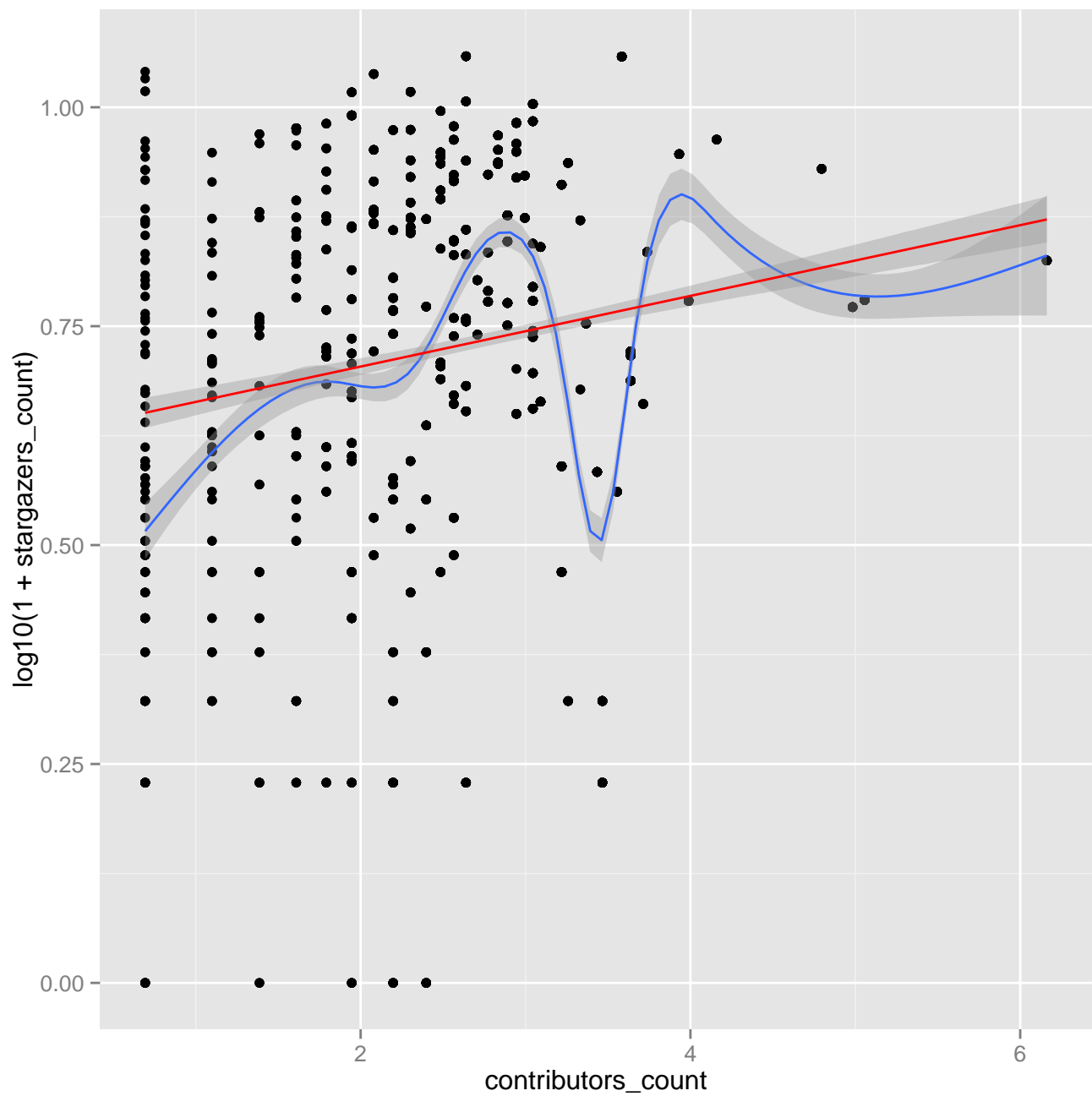


```
summary(D$project_activity_level)
```

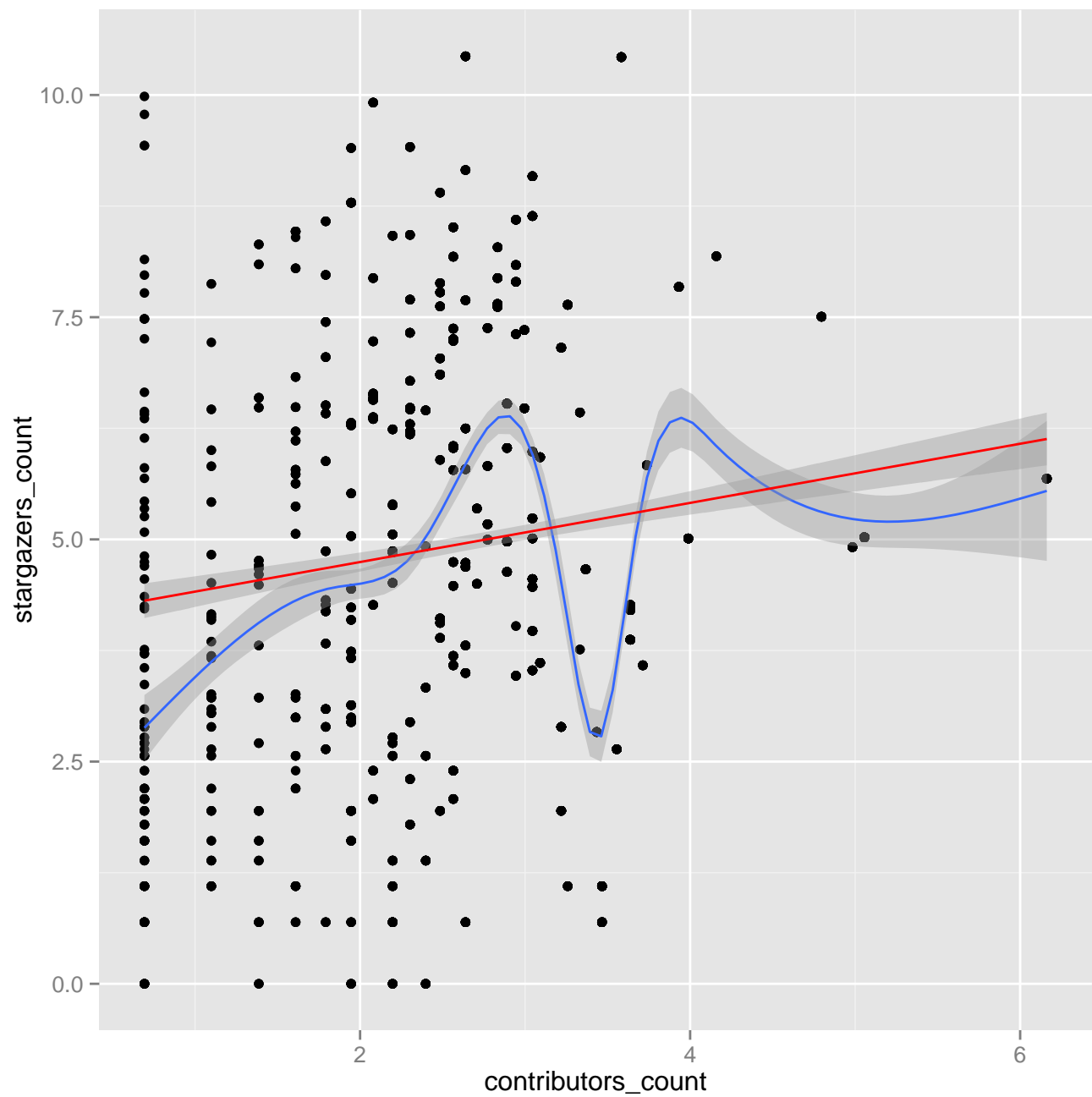
```
##      Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##      0.00   30.00   50.00   44.16   70.00   70.00
```

```
D$contributors_count <- log(1+D$contributors_count)
D$stargazers_count <- log(1+D$stargazers_count)
D$project_rating_count <- log(1+D$project_rating_count)
```

```
ggplot(D, aes(x=contributors_count, y=log10(1+stargazers_count))) + geom_point() + geom_smooth() + geom_smooth(
## geom_smooth: method="auto" and size of largest group is >=1000, so using gam with formula: y ~ s(x,
bs = "cs"). Use 'method = x' to change the smoothing method.
```

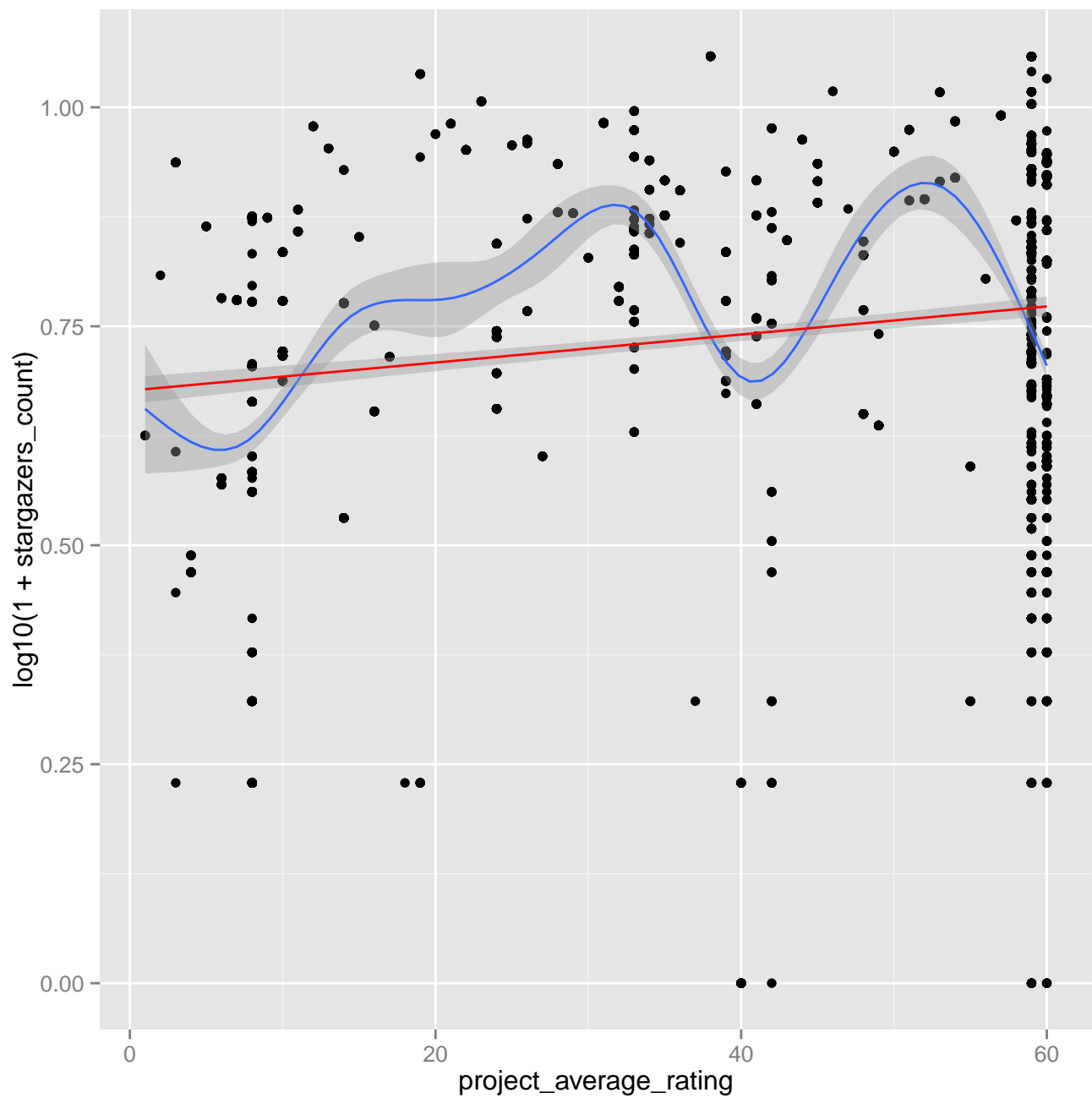


```
ggplot(D, aes(x=contributors_count, y=stargazers_count)) + geom_point() + geom_smooth() + geom_smooth(method=
## geom_smooth: method="auto" and size of largest group is >=1000, so using gam with formula: y ~ s(x,
bs = "cs"). Use 'method = x' to change the smoothing method.
```



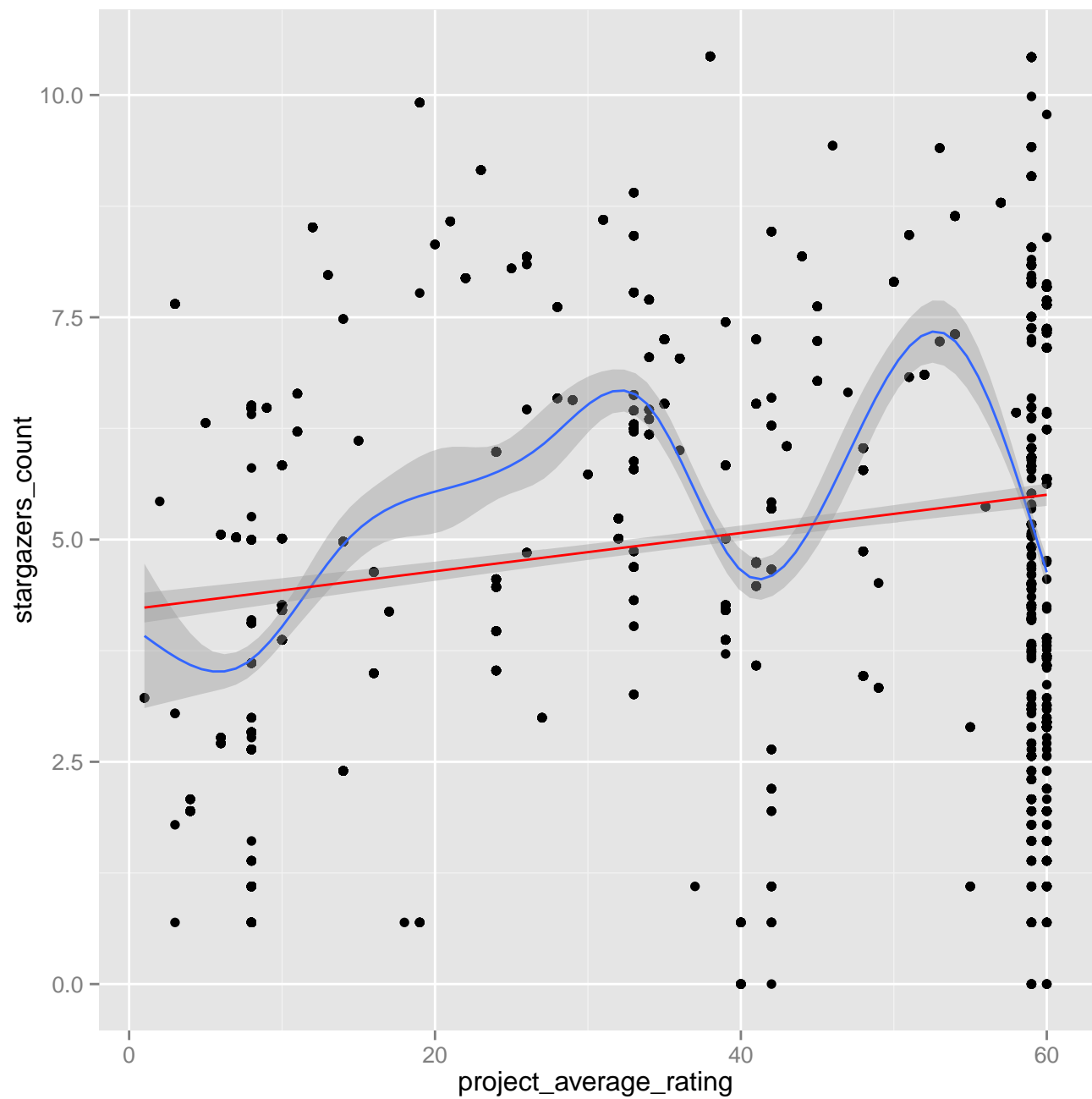
```
ggplot(D, aes(x=project_average_rating, y=log10(1+stargazers_count))) + geom_point() + geom_smooth() + geom_s

## geom_smooth: method="auto" and size of largest group is >=1000, so using gam with formula: y ~ s(x,
bs = "cs"). Use 'method = x' to change the smoothing method.
```



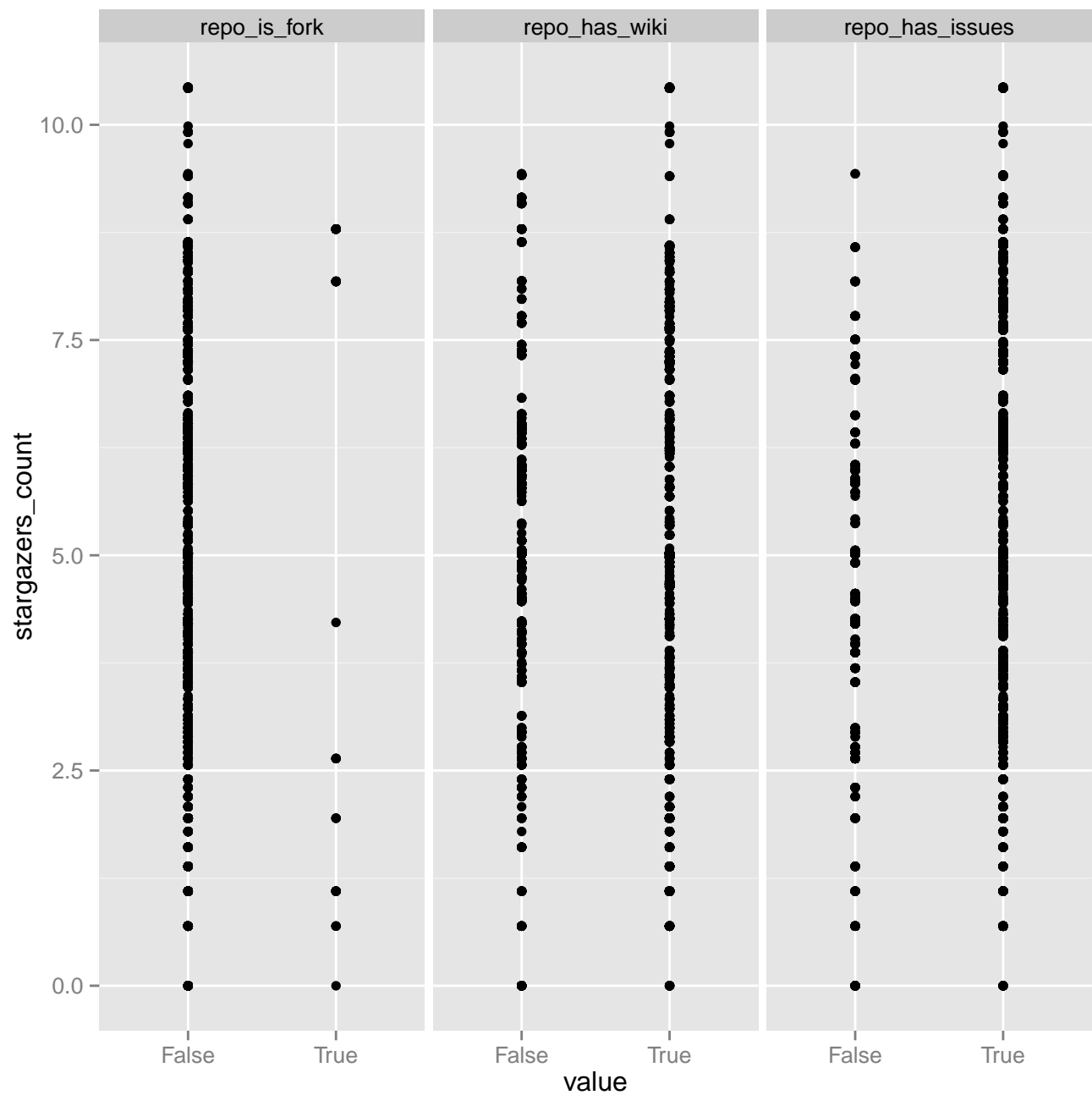
```
ggplot(D, aes(x=project_average_rating, y=stargazers_count)) + geom_point() + geom_smooth() + geom_smooth(method="gam",
## geom_smooth: method="auto" and size of largest group is >=1000, so using gam with formula: y ~ s(x,
bs = "cs"). Use 'method = x' to change the smoothing method.
```





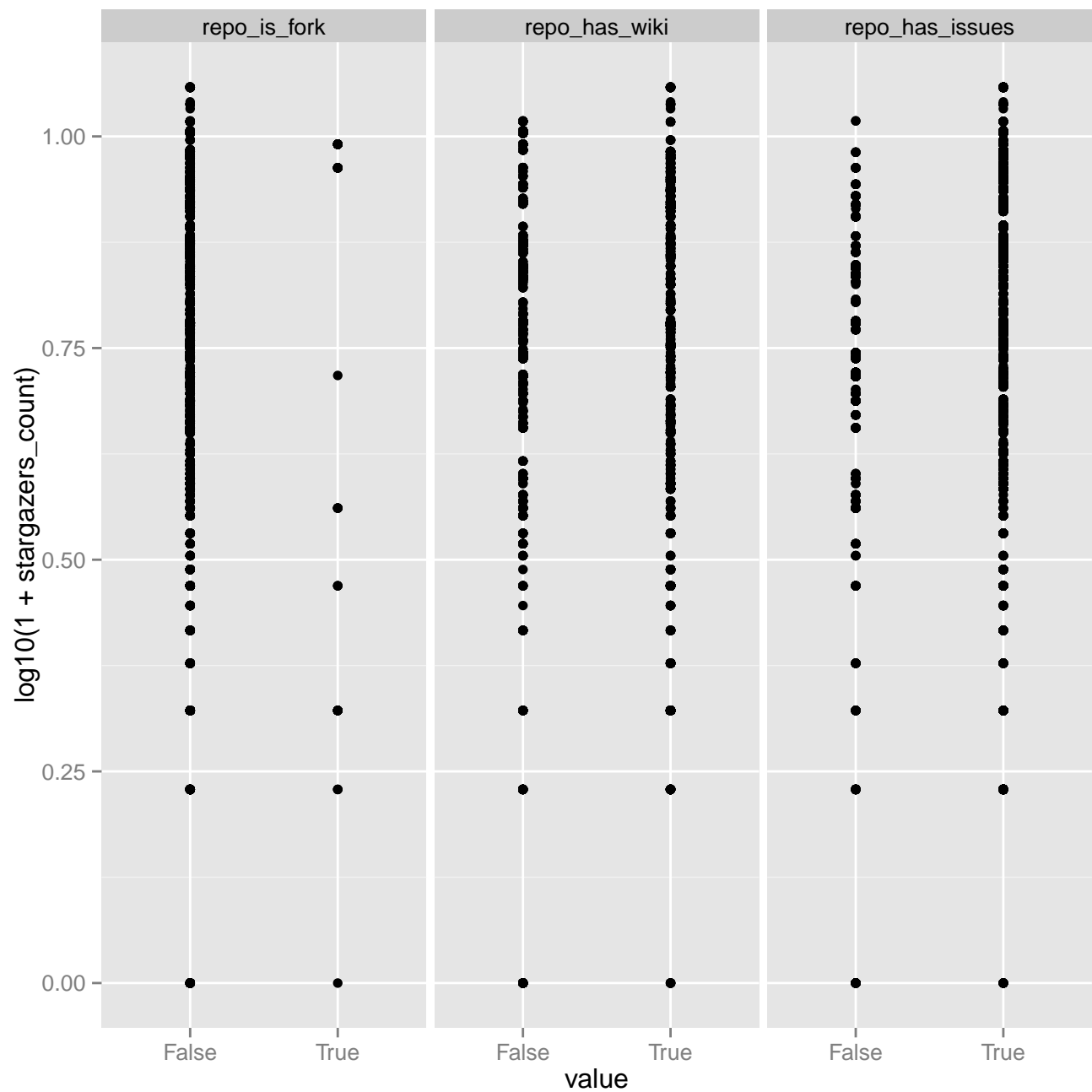
```
attrs <- c("repo_is_fork",
           "repo_has_wiki", "repo_has_issues")
d <- cbind(melt(D[,attrs], id.vars=c()), stargazers_count=D$stargazers_count)
ggplot(d,aes(x = value, y=stargazers_count)) +
  facet_wrap(~variable, scales = "free_x") +
  geom_point() + geom_smooth() + geom_smooth(method=lm, color="red")
```

```
## geom_smooth: Only one unique x value each group.Maybe you want aes(group = 1)?
## geom_smooth: Only one unique x value each group.Maybe you want aes(group = 1)?
## geom_smooth: Only one unique x value each group.Maybe you want aes(group = 1)?
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## geom_smooth: Only one unique x value each group.Maybe you want aes(group = 1)?
## geom_smooth: Only one unique x value each group.Maybe you want aes(group = 1)?
```



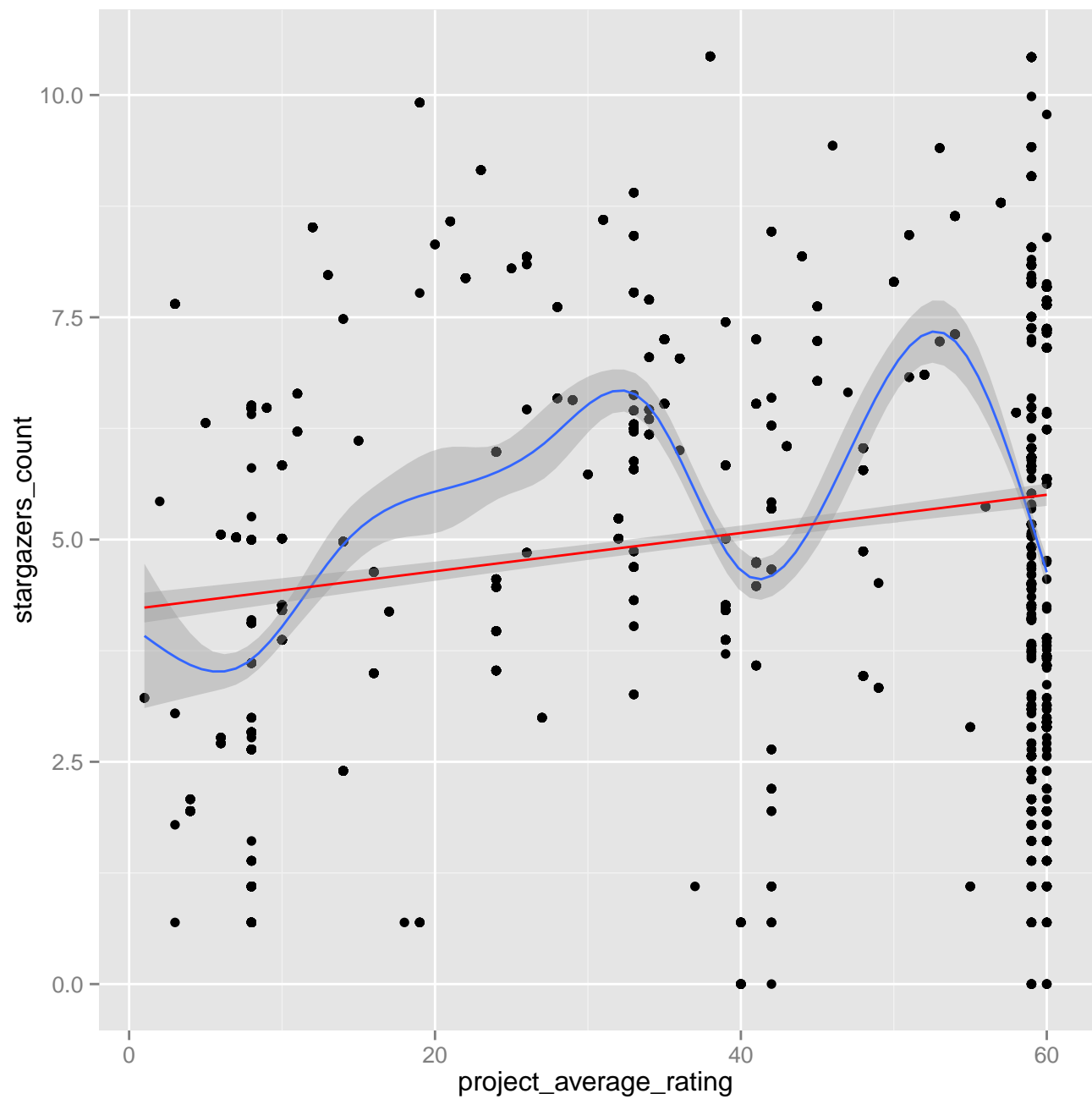
```
ggplot(d,aes(x = value, y=log10(1+stargazers_count))) +
  facet_wrap(~variable, scales = "free_x") +
  geom_point() + geom_smooth() + geom_smooth(method=lm, color="red")
```

## geom\_smooth: Only one unique x value each group.Maybe you want aes(group = 1)?  
 ## geom\_smooth: Only one unique x value each group.Maybe you want aes(group = 1)?  
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 ## geom\_smooth: Only one unique x value each group.Maybe you want aes(group = 1)?  
 ## geom\_smooth: Only one unique x value each group.Maybe you want aes(group = 1)?



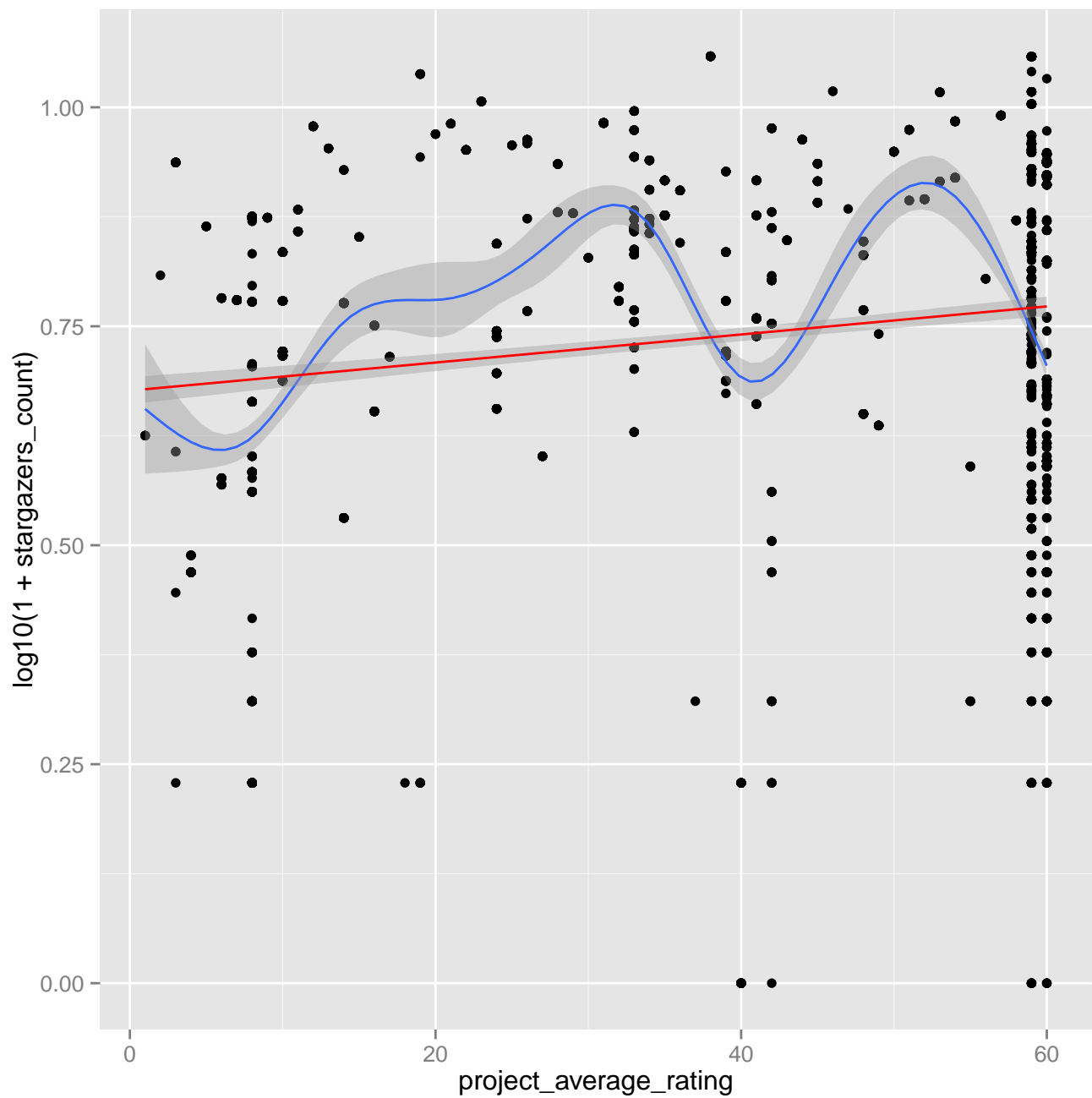
```
ggplot(D,aes(x = project_average_rating, y=stargazers_count)) +
  geom_point() + geom_smooth() + geom_smooth(method=lm, color="red")
```

*## geom\_smooth: method="auto" and size of largest group is >=1000, so using gam with formula:  $y \sim s(x, bs = "cs")$ . Use 'method = x' to change the smoothing method.*



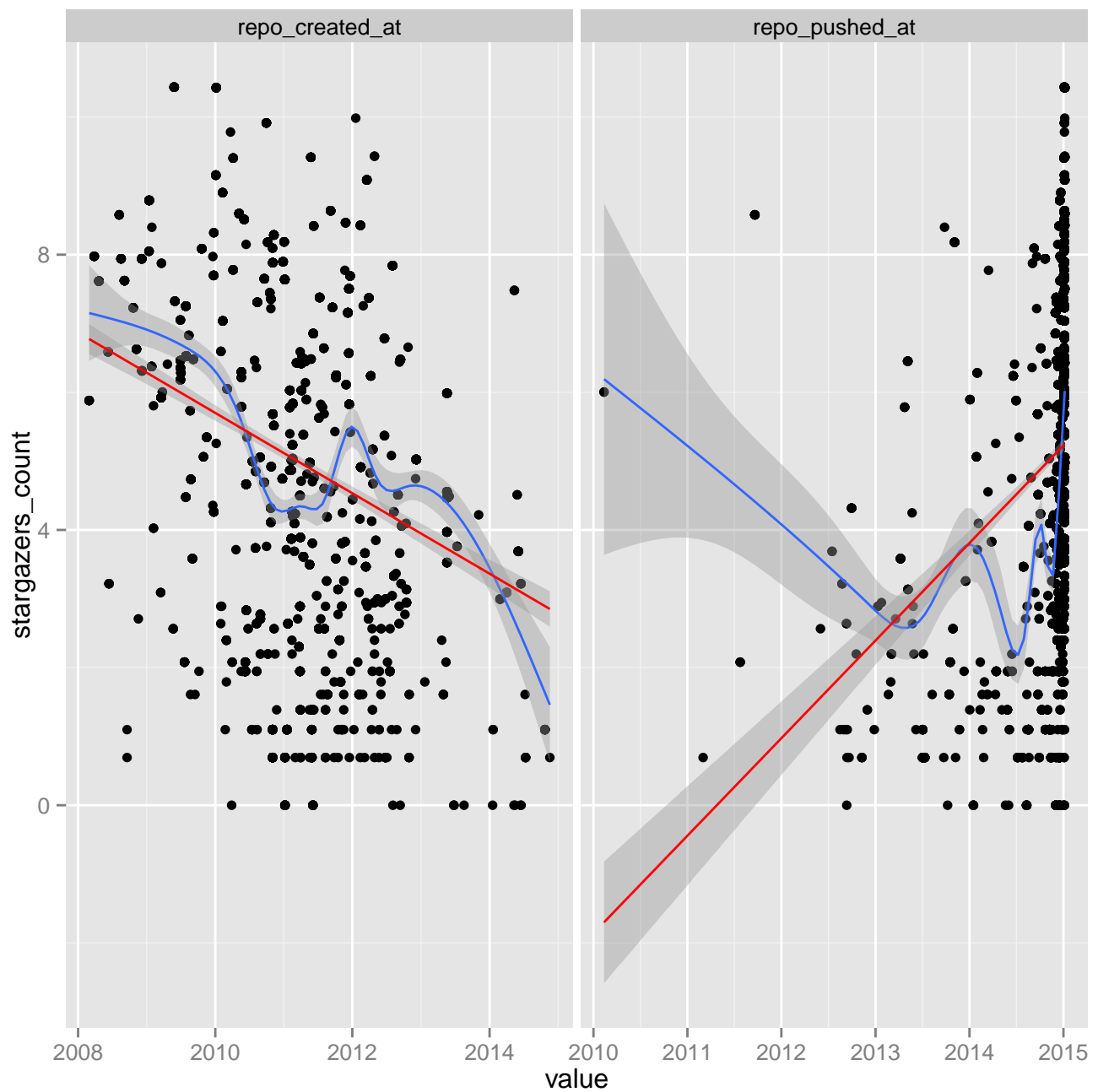
```
ggplot(D,aes(x = project_average_rating, y=log10(1+stargazers_count))) +
  geom_point() + geom_smooth() + geom_smooth(method=lm, color="red")
```

*## geom\_smooth: method="auto" and size of largest group is >=1000, so using gam with formula:  $y \sim s(x, bs = "cs")$ . Use 'method = x' to change the smoothing method.*



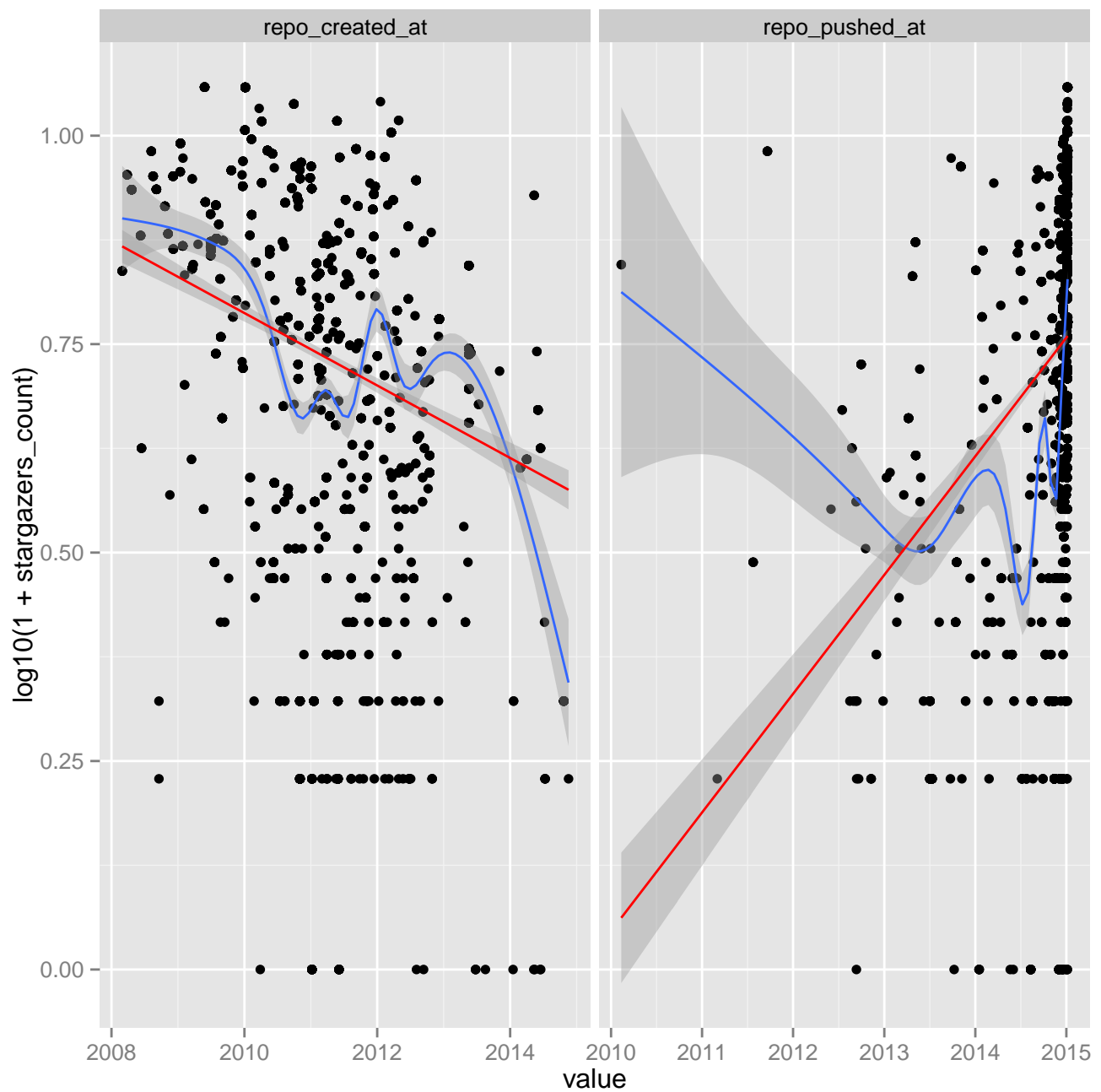
```
d <- cbind(melt(D[,c("repo_created_at", "repo_pushed_at")], id.vars=c()), stargazers_count=D$stargazers_count)
d$value <- as.Date(d$value, origin="1970-10-01")
ggplot(d,aes(x = value, y=stargazers_count)) +
  facet_wrap(~variable, scales = "free_x") +
  geom_point() + geom_smooth() + geom_smooth(method=lm, color="red")
```

```
## geom_smooth: method="auto" and size of largest group is >=1000, so using gam with formula: y ~ s(x,
bs = "cs"). Use 'method = x' to change the smoothing method.
## geom_smooth: method="auto" and size of largest group is >=1000, so using gam with formula: y ~ s(x,
bs = "cs"). Use 'method = x' to change the smoothing method.
```



```
ggplot(d,aes(x = value, y=log10(1+stargazers_count))) +
  facet_wrap(~variable, scales = "free_x") +
  geom_point() + geom_smooth() + geom_smooth(method=lm, color="red")
```

## geom\_smooth: method="auto" and size of largest group is >=1000, so using gam with formula:  $y \sim s(x, bs = "cs")$ . Use 'method = x' to change the smoothing method.  
 ## geom\_smooth: method="auto" and size of largest group is >=1000, so using gam with formula:  $y \sim s(x, bs = "cs")$ . Use 'method = x' to change the smoothing method.



```
D$stargazers_count <- log(1+D$stargazers_count)
```

```
par(mfrow=c(2,2))
m <- lm(stargazers_count ~ contributors_count + repo_pushed_at + repo_created_at, D, na.action=na.exclude)
summary(m)

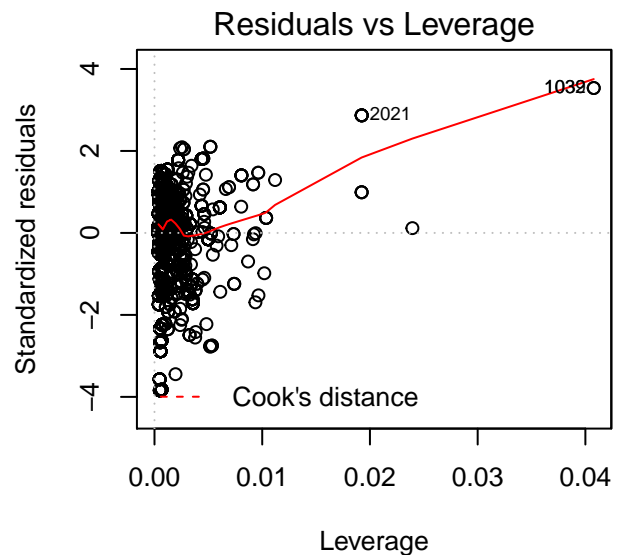
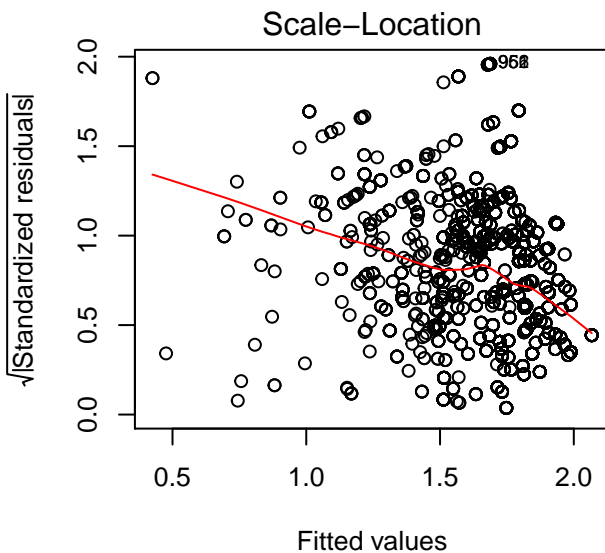
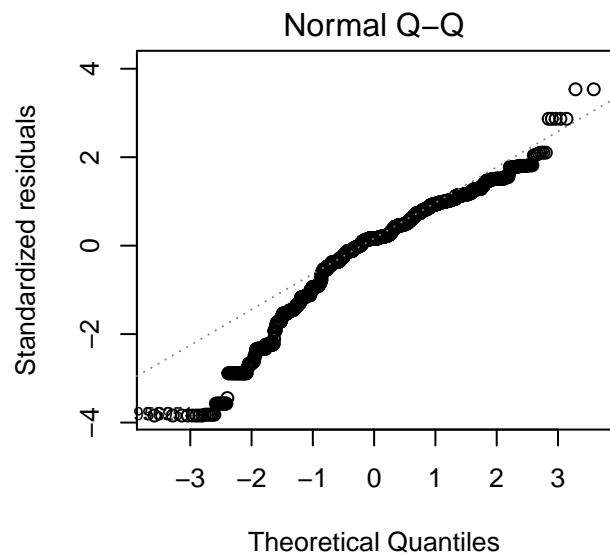
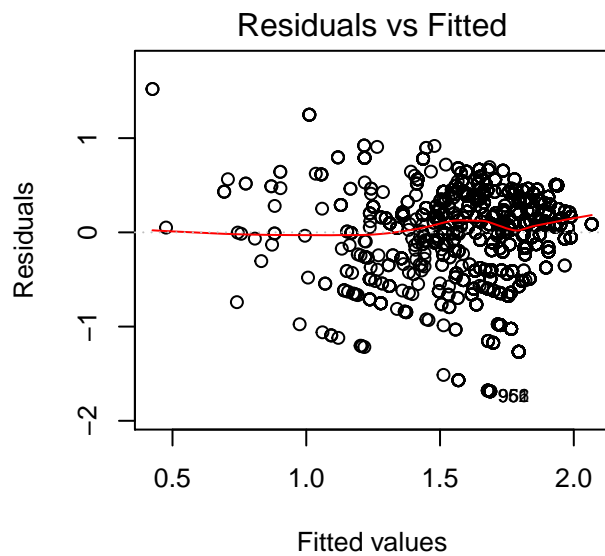
##
## Call:
## lm(formula = stargazers_count ~ contributors_count + repo_pushed_at +
##     repo_created_at, data = D, na.action = na.exclude)
##
## Residuals:
```

	Min	1Q	Median	3Q	Max
##	-1.68759	-0.16563	0.07233	0.31130	1.52133

```
##
```

```
## Coefficients:
##               Estimate Std. Error t value Pr(>|t|)
## (Intercept)   -6.724e+00  8.975e-01  -7.492 8.93e-14 ***
## contributors_count  7.909e-02  8.534e-03   9.268 < 2e-16 ***
## repo_pushed_at    7.852e-04  5.233e-05  15.005 < 2e-16 ***
## repo_created_at   -3.100e-04  1.838e-05 -16.866 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.4394 on 2948 degrees of freedom
## Multiple R-squared:  0.1805, Adjusted R-squared:  0.1797
## F-statistic: 216.4 on 3 and 2948 DF,  p-value: < 2.2e-16
```

```
plot(m)
```





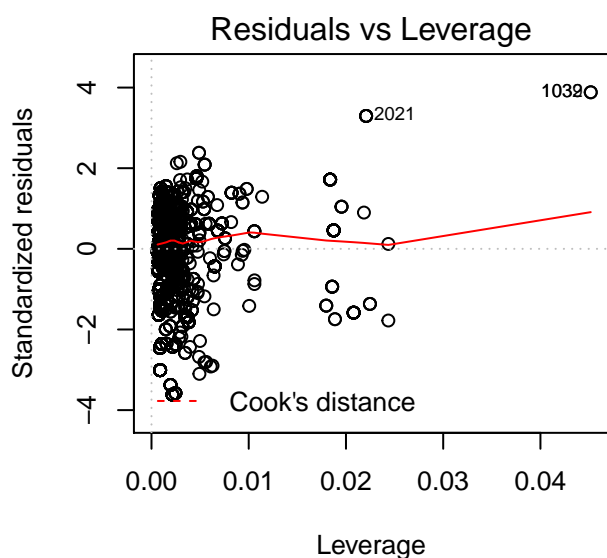
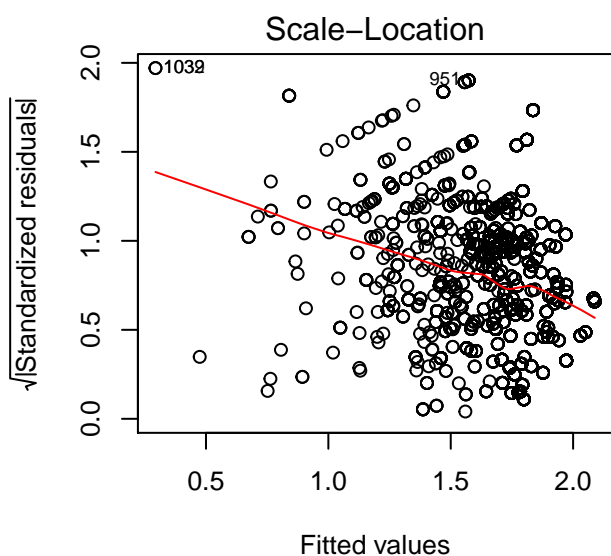
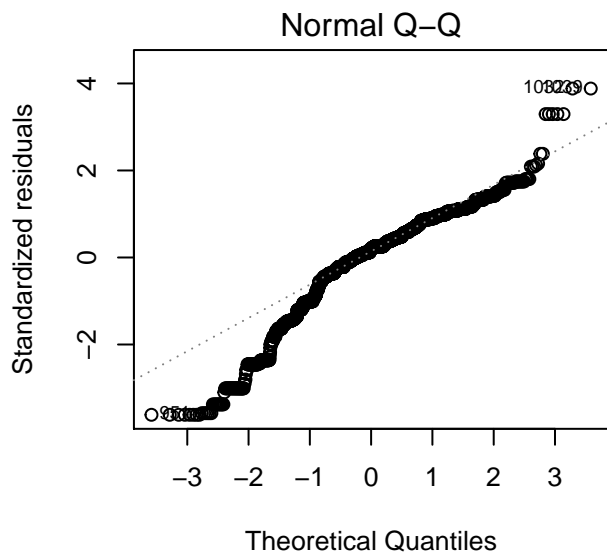
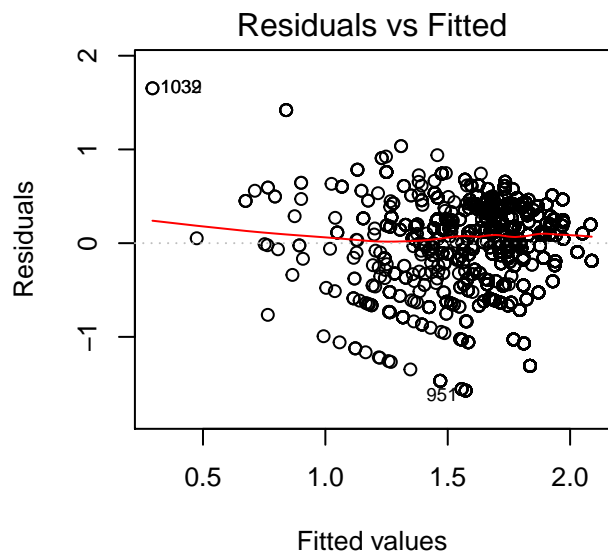
```

par(mfrow=c(2,2))
m2 <- lm(stargazers_count ~ contributors_count + repo_pushed_at + repo_created_at + repo_is_fork + repo_has_wiki + repo_has_issues,
summary(m2)

##
## Call:
## lm(formula = stargazers_count ~ contributors_count + repo_pushed_at +
##      repo_created_at + repo_is_fork + repo_has_wiki + repo_has_issues,
##      data = D, na.action = na.exclude)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -1.57349 -0.16296  0.08774  0.28645  1.65279
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   -7.138e+00  9.039e-01  -7.896 4.02e-15 ***
## contributors_count  1.083e-01  9.435e-03  11.481 < 2e-16 ***
## repo_pushed_at    7.611e-04  5.303e-05  14.351 < 2e-16 ***
## repo_created_at   -2.679e-04  1.917e-05 -13.976 < 2e-16 ***
## repo_is_forkTrue  1.734e-01  5.806e-02   2.987  0.00284 **
## repo_has_wikiTrue -3.661e-02  1.855e-02  -1.974  0.04844 *
## repo_has_issuesTrue 1.580e-01  2.218e-02   7.122 1.33e-12 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.4356 on 2945 degrees of freedom
## Multiple R-squared:  0.1955, Adjusted R-squared:  0.1939
## F-statistic: 119.3 on 6 and 2945 DF,  p-value: < 2.2e-16

plot(m2)

```



```
anova(m, m2)
```

```
## Analysis of Variance Table
```

```
##
```

```
## Model 1: stargazers_count ~ contributors_count + repo_pushed_at + repo_created_at
```

```
## Model 2: stargazers_count ~ contributors_count + repo_pushed_at + repo_created_at +
```

```
## repo_is_fork + repo_has_wiki + repo_has_issues
```

```
## Res.Df RSS Df Sum of Sq F Pr(>F)
```

```
## 1 2948 569.23
```

```
## 2 2945 558.81 3 10.421 18.306 9.127e-12 ***
```

```
## ---
```

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

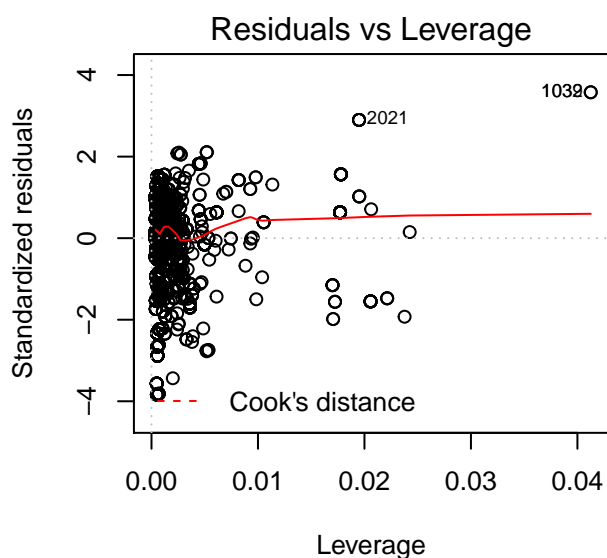
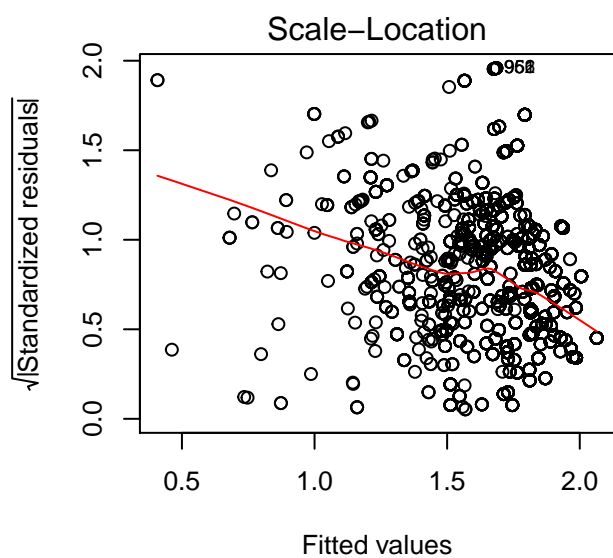
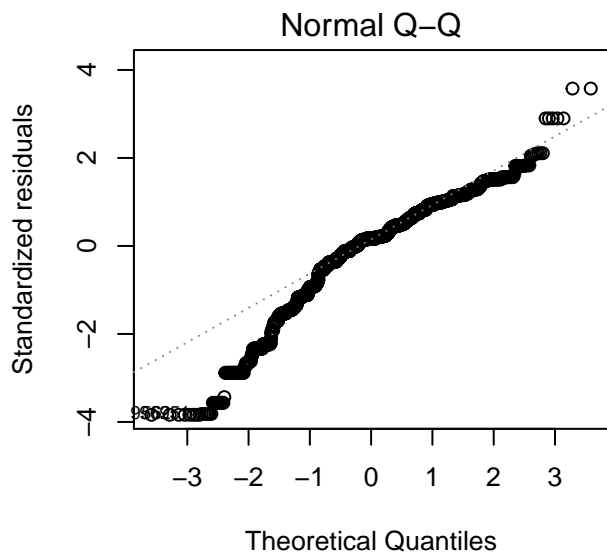
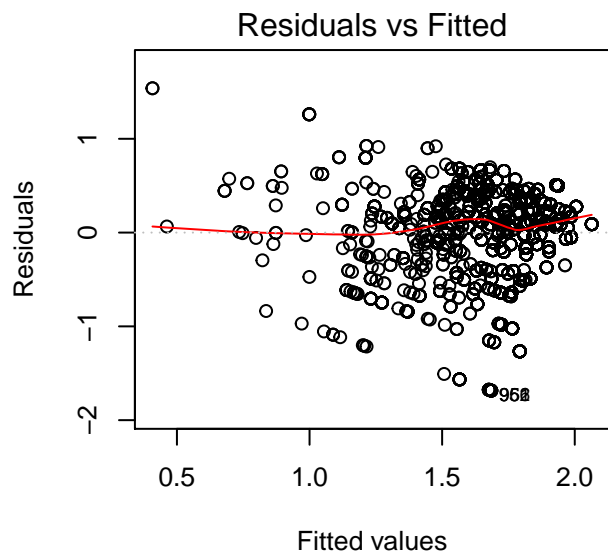
```
par(mfrow=c(2,2))
```

```
m3 <- lm(stargazers_count ~ contributors_count + repo_pushed_at + repo_created_at + repo_is_fork, D, na.action=na.omit)
```

```
summary(m3)
```

```
##
## Call:
## lm(formula = stargazers_count ~ contributors_count + repo_pushed_at +
##      repo_created_at + repo_is_fork, data = D, na.action = na.exclude)
##
## Residuals:
##      Min        1Q    Median        3Q        Max
## -1.68505 -0.16469  0.07116  0.29698  1.53868
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)   -6.869e+00  9.007e-01  -7.626 3.25e-14 ***
## contributors_count  7.999e-02  8.545e-03   9.361 < 2e-16 ***
## repo_pushed_at     7.926e-04  5.247e-05  15.106 < 2e-16 ***
## repo_created_at    -3.087e-04  1.839e-05 -16.791 < 2e-16 ***
## repo_is_forkTrue   1.046e-01  5.774e-02   1.812  0.0701 .
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.4393 on 2947 degrees of freedom
## Multiple R-squared:  0.1814, Adjusted R-squared:  0.1803
## F-statistic: 163.3 on 4 and 2947 DF,  p-value: < 2.2e-16

plot(m3)
```



```
anova(m, m3)

## Analysis of Variance Table
##
## Model 1: stargazers_count ~ contributors_count + repo_pushed_at + repo_created_at
## Model 2: stargazers_count ~ contributors_count + repo_pushed_at + repo_created_at +
##   repo_is_fork
##   Res.Df    RSS Df Sum of Sq    F Pr(>F)
## 1     2948 569.23
## 2     2947 568.60  1    0.63359 3.2838 0.07007 .
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
D$star_resid <- resid(m3)
```

```
save(D, file = "../project_stars.RData")
```