

Lineare Regression

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Die lineare Regression

Maindonald - Data Analysis

- ▶ Einführung in R
- ▶ Datenanalyse
- ▶ Statistische Modelle
- ▶ Inferenzkonzepte
- ▶ Regression mit einem Prädiktor
- ▶ Multiple lineare Regression
- ▶ Ausweitung des linearen Modells
- ▶ ...

Lineare Regression in R - Beispieldatensatz

John H. Maindonald and W. John Braun

DAAG - Data Analysis and Graphics Data and Functions

```
install.packages("DAAG")
```

```
library("DAAG")  
data(roller)
```

help on roller data:

```
?roller
```

Das lineare Regressionsmodell in R

Schätzen eines Regressionsmodells:

```
roller.lm <- lm(depression ~ weight, data = roller)
```

So bekommt man die Schätzwerte:

```
summary(roller.lm)
```

```
##  
## Call:  
## lm(formula = depression ~ weight, data = roller)  
##  
## Residuals:  
##      Min       1Q   Median       3Q      Max   
## -8.180 -5.580 -1.346  5.920  8.020   
##  
## Coefficients:  
##              Estimate Std. Error t value Pr(>|t|)      
## (Intercept)  -2.0871      4.7543  -0.439  0.67227
```

Summary des Modells

```
summary(roller.lm)
```

```
##
```

```
## Call:
```

```
## lm(formula = depression ~ weight, data = roller)
```

```
##
```

```
## Residuals:
```

```
##      Min       1Q   Median       3Q      Max  
## -8.180 -5.580 -1.346   5.920   8.020
```

```
##
```

```
## Coefficients:
```

```
##              Estimate Std. Error t value Pr(>|t|)  
## (Intercept)  -2.0871     4.7543  -0.439  0.67227  
## weight        2.6667     0.7002   3.808  0.00518 **
```

```
## ---
```

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

```
##
```

```
## Residual standard error: 6.735 on 8 degrees of freedom
```

R arbeitet mit Objekten

- ▶ `roller.lm` ist nun ein spezielles Regressions-Objekt
- ▶ Auf dieses Objekt können nun verschiedene Funktionen angewendet werden

```
predict(roller.lm) # Vorhersage
```

```
##           1           2           3           4           5
## 2.979669  6.179765  6.713114 10.713233 12.046606 14.180
##           8           9          10
## 18.180121 24.046962 30.980502
```

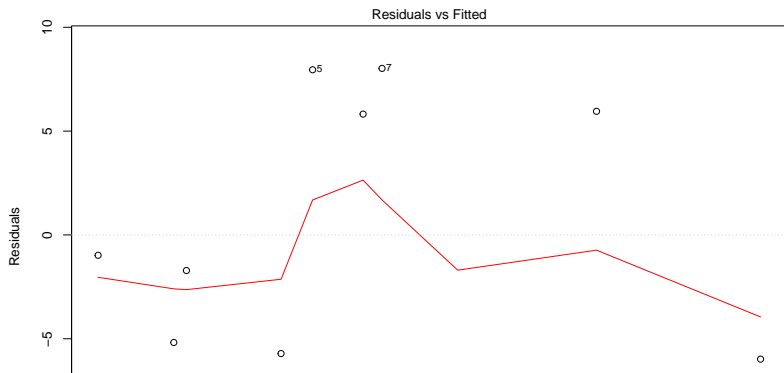
```
resid(roller.lm) # Residuen
```

```
##           1           2           3           4           5
## -0.9796695 -5.1797646 -1.7131138 -5.7132327  7.9533944
##           7           8           9          10
##  8.0199738 -8.1801213  5.9530377 -5.9805017
```

Residuenplot

- ▶ Sind Annahmen des linearen Regressionsmodells verletzt?
- ▶ Dies ist der Fall, wenn ein Muster abweichend von einer Linie zu erkennen ist.
- ▶ Hier ist der Datensatz sehr klein

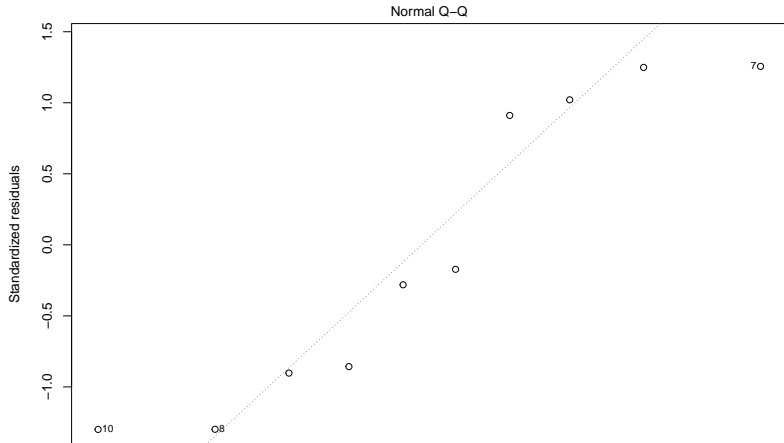
```
plot(roller.lm,1)
```



Residuenplot

- ▶ Wenn die Residuen normalverteilt sind sollten sie auf einer Linie liegen.

```
plot(roller.lm,2)
```



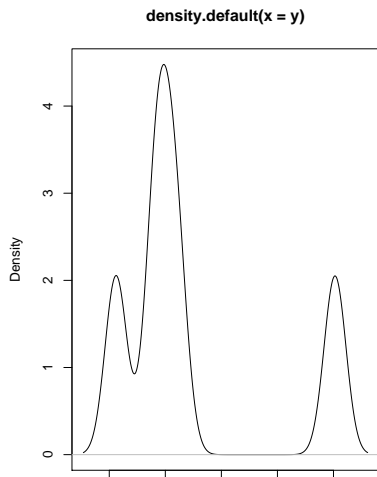
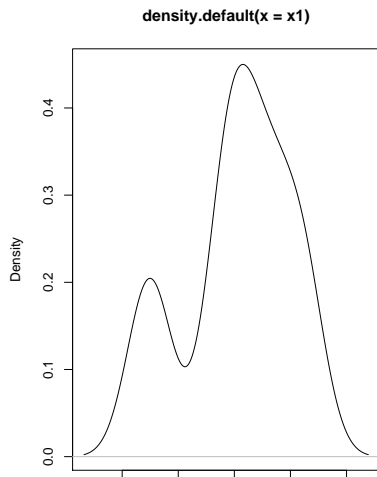
Regressionsdiagnostik mit Basis-R

Ein einfaches Modell

```
N <- 5  
x1 <- rnorm(N)  
y <- runif(N)
```

Die Dichte der beiden Vektoren

```
par(mfrow=c(1,2))  
plot(density(x1))  
plot(density(y))
```



Modellvorhersage machen

```
mod1 <- lm(y~x1)
pre <- predict(mod1)
y
```

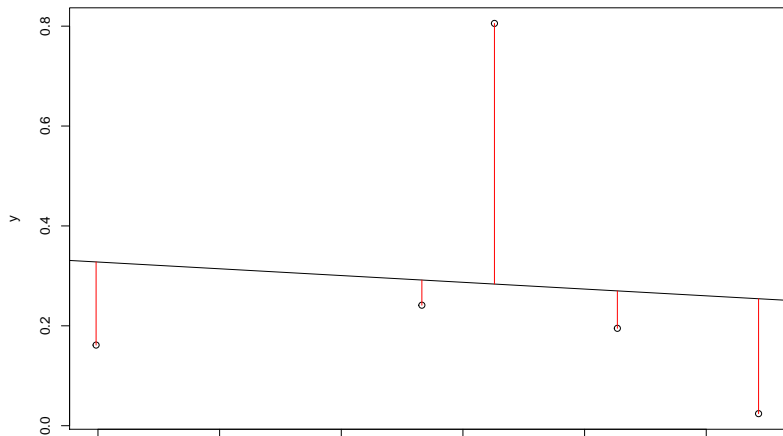
```
## [1] 0.80546933 0.19499632 0.24129626 0.02413855 0.161443
```

```
pre
```

```
##           1           2           3           4           5
## 0.2836019 0.2699229 0.2916785 0.2542092 0.3279318
```

Regressionsdiagnostik mit Basis-R

```
plot(x1,y)  
abline(mod1)  
segments(x1, y, x1, pre, col="red")
```



Beispieldaten Luftqualit t

```
library(datasets)  
?airquality
```

```
airquality {datasets}
```

New York Air Quality Measurements

Description

Daily air quality measurements in New York, May to September 1973.

Usage

```
airquality
```

Format

A data frame with 154 observations on 6 variables.

[,1] Ozone numeric Ozone (ppb)

[,2] Solar.R numeric Solar R (lang)

Das visreg-Paket

Ein Modell wird auf dem airquality Datensatz geschätzt

```
install.packages("visreg")
```

```
library(visreg)
fit <- lm(Ozone ~ Solar.R + Wind + Temp, data = airquality)
summary(fit)
```

```
##
```

```
## Call:
```

```
## lm(formula = Ozone ~ Solar.R + Wind + Temp, data = airquality)
```

```
##
```

```
## Residuals:
```

```
##      Min       1Q   Median       3Q      Max
## -40.485 -14.219  -3.551   10.097   95.619
```

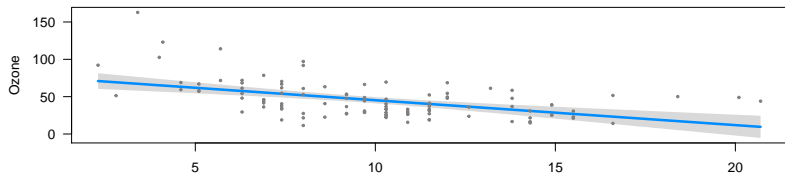
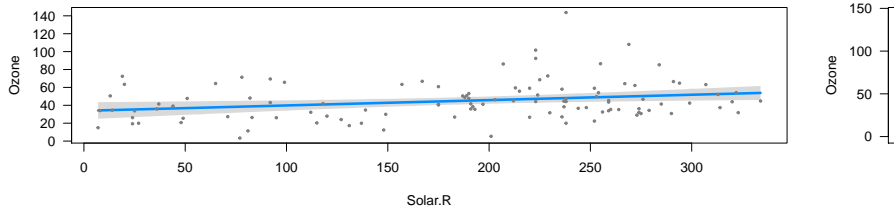
```
##
```

```
## Coefficients:
```

```
##              Estimate Std. Error t value Pr(>|t|)
```

Visualisierung

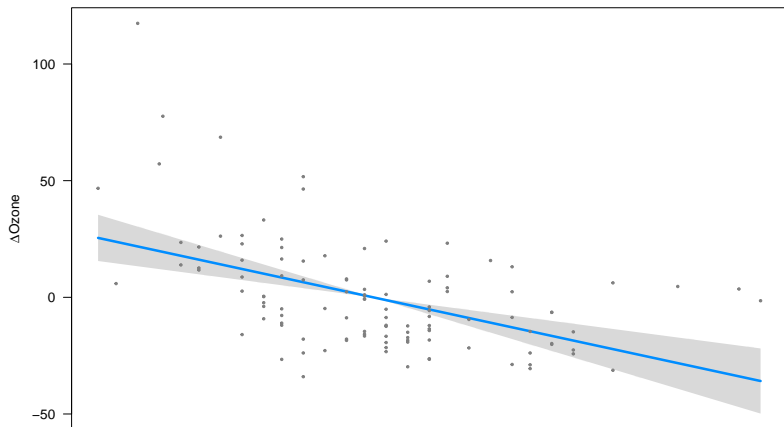
```
par(mfrow=c(2,1))  
visreg(fit)
```



Und dann mit visreg visualisiert.

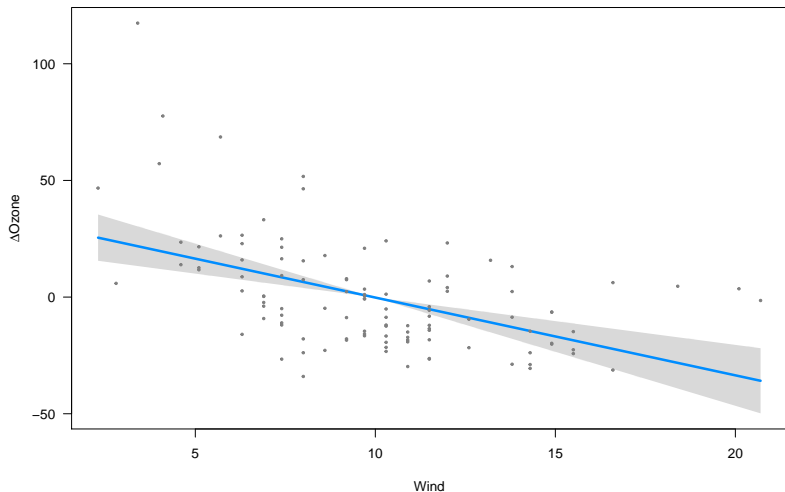
- Zweites Argument - Spezifikation erklärende Variable für Visualisierung

```
visreg(fit, "Wind", type = "contrast")
```



Visualisierung mit dem Paket visreg

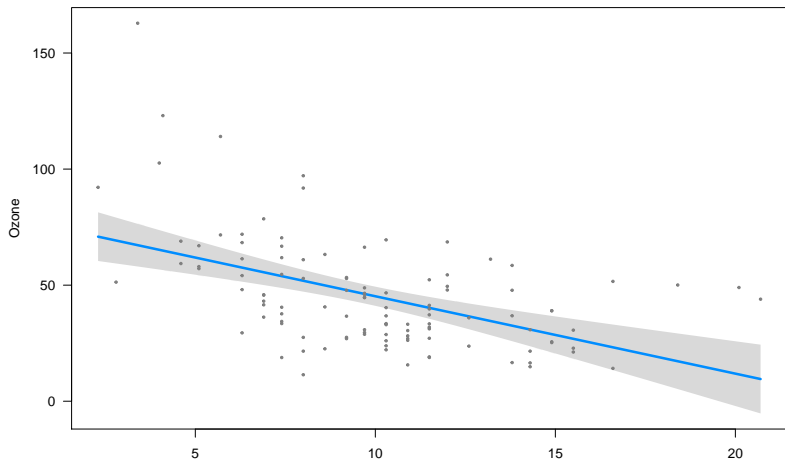
```
visreg(fit, "Wind", type = "contrast")
```



Das visreg-Paket

- Das Default-Argument `full = FALSE` ist conditional.

```
visreg(fit, "Wind", type = "conditional")
```



Regression mit Faktoren

Mit visreg können die Effekte bei Faktoren visualisiert werden.

```
airquality$Heat <- cut(airquality$Temp, 3,  
  labels=c("Cool", "Mild", "Hot"))  
fit.heat <- lm(Ozone ~ Solar.R + Wind + Heat,  
  data = airquality)  
summary(fit.heat)
```

```
##
```

```
## Call:
```

```
## lm(formula = Ozone ~ Solar.R + Wind + Heat, data = airqu
```

```
##
```

```
## Residuals:
```

```
##      Min       1Q   Median       3Q      Max  
## -33.473 -12.794  -2.686   8.461 107.035
```

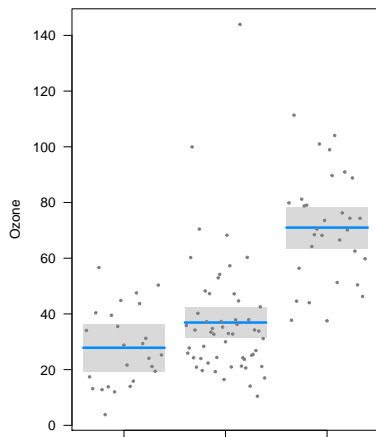
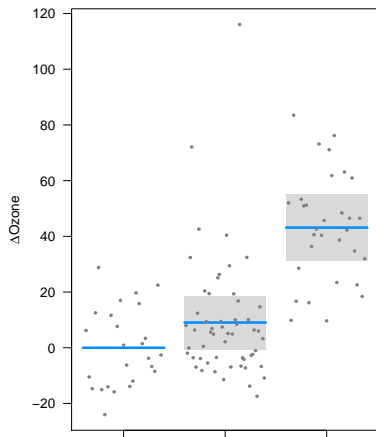
```
##
```

```
## Coefficients:
```

```
##              Estimate Std. Error t value Pr(>|t|)
```

Effekte von Faktoren

```
par(mfrow=c(1,2))  
visreg(fit.heat, "Heat", type = "contrast")  
visreg(fit.heat, "Heat", type = "conditional")
```



Das Paket visreg - Interaktionen

```
airquality$Heat <- cut(airquality$Temp, 3,  
labels=c("Cool", "Mild", "Hot"))  
fit <- lm(Ozone ~ Solar.R + Wind * Heat, data = airquality)  
summary(fit)
```

```
##
```

```
## Call:
```

```
## lm(formula = Ozone ~ Solar.R + Wind * Heat, data = airqu
```

```
##
```

```
## Residuals:
```

```
##      Min       1Q   Median       3Q      Max
```

```
## -34.472 -11.640  -1.919   7.403 102.428
```

```
##
```

```
## Coefficients:
```

```
##              Estimate Std. Error t value Pr(>|t|)
```

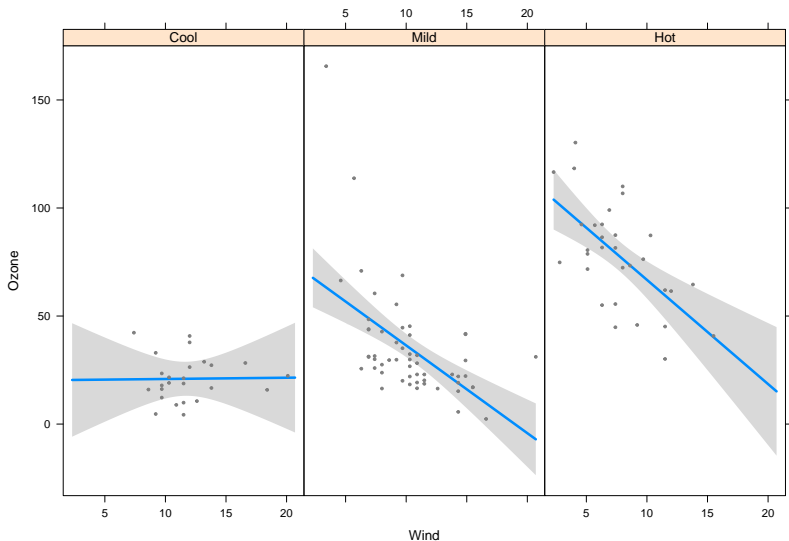
```
## (Intercept)    4.48042    17.38219   0.258 0.797102
```

```
## Solar.R        0.07634     0.02137   3.572 0.000538 ***
```

```
## Wind          0.05854     1.34860   0.043 0.965458
```

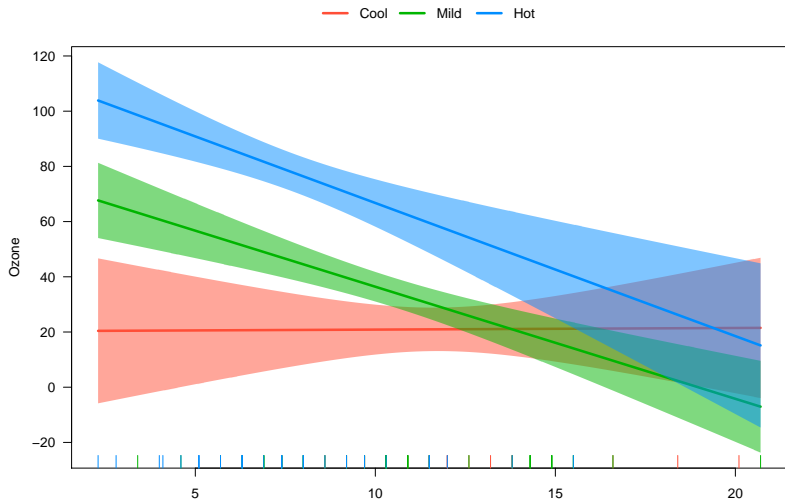
Steuern der Graphikausgabe mittels layout

```
visreg(fit, "Wind", by = "Heat", layout=c(3,1))
```



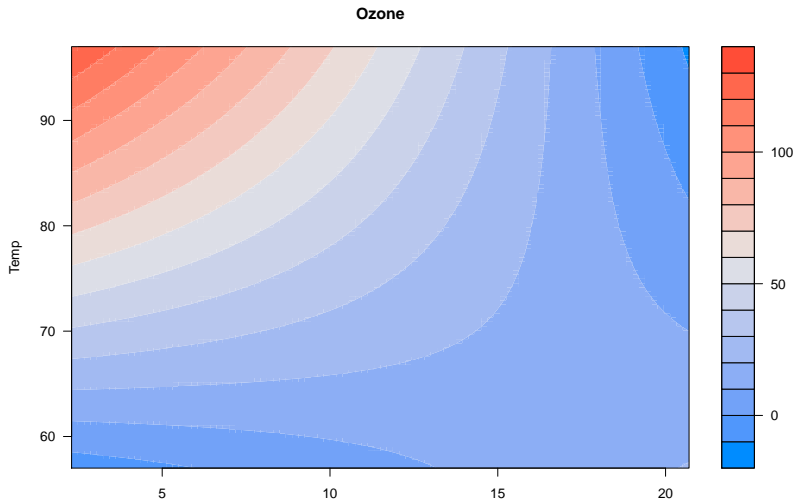
Das Paket visreg - Interaktionen overlay

```
fit <- lm(Ozone ~ Solar.R + Wind * Heat, data = airquality)
visreg(fit, "Wind", by="Heat", overlay=TRUE, partial=FALSE)
```



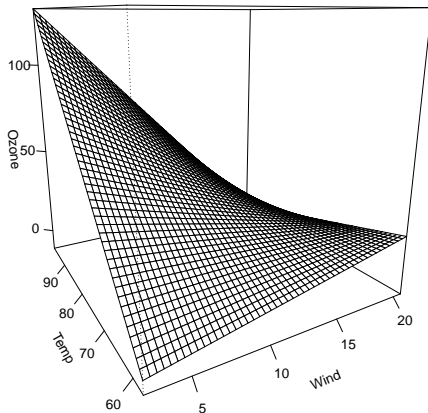
Das Paket visreg - visreg2d

```
fit2 <- lm(Ozone ~ Solar.R + Wind * Temp, data = airquality)
visreg2d(fit2, "Wind", "Temp", plot.type = "image")
```



Das Paket visreg - surface

```
visreg2d(fit2, "Wind", "Temp", plot.type = "persp")
```



Linkliste - lineare Regression

- ▶ Regression - r-bloggers
- ▶ Das Komplette Buch von Faraway- sehr intuitiv geschrieben.
- ▶ Gute Einführung auf Quick-R
- ▶ Multiple Regression
- ▶ Basis Regression - How to go about interpreting regression coefficients