Ch_07_Regression Analysis

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Download data

Downloading data from the website. The download command downloads data in the working directory.

Data are downloaded, loaded, and names of fields are read from the file:

```
setInternet2(TRUE) # solution for https files

download.file("https://sites.google.com/site/econometriks/docs/housing88.RData", "housing88.RData")

load("housing88.RData")

setwd("C:/Users/Regionomics/Documents/Research_2/All_else_being_equal/Chapters/Ch07_Regression/Data/Regression_housing/Housing prices/88_units")

names(housing88)
```

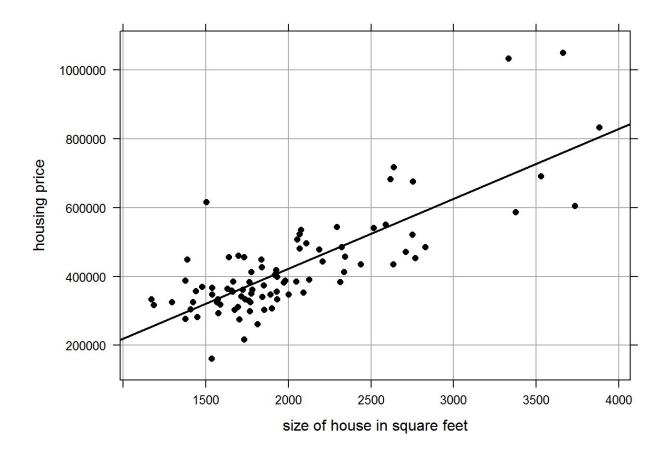
```
## [1] "assess" "bdrms" "lotsize" "sqrft" "colonial" "lprice"
## [7] "lassess" "llotsize" "lsqrft" "bedsq" "lnrooms" "hprice"
```

Loading required packages and attaching the data set.

```
attach(housing88)

library(lattice)
lattice.options(default.theme = standard.theme(color = FALSE))
trellis.device(color = FALSE)
```

Figure 7.3



```
library(stargazer)
```

```
##
## Please cite as:
##
## Hlavac, Marek (2014). stargazer: LaTeX code and ASCII text for well-formatt
ed regression and summary statistics tables.
## R package version 5.1. http://CRAN.R-project.org/package=stargazer
```

```
stargazer(housing88, type="html", digits=2)
```

Statistic	c N	Mean	St. Dev.	Min	Max
assess	88	315.74	95.31	198.70	708.60
bdrms	88	3.57	0.84	2	7
lotsize	88	9,019.86	10,174.15	1,000	92,681
sqrft	88	2,013.69	577.19	1,171	3,880
colonia	188	0.69	0.46	0	1
Iprice	88	5.63	0.30	4.71	6.59

lassess	88	5.72	0.26	5.29	6.56
llotsize	88	8.91	0.54	6.91	11.44
Isqrft	88	7.57	0.26	7.07	8.26
bedsq	88	13.43	6.87	4	49
Inrooms	88a	1.25	0.23	0.69	1.95
hprice	8842	5,641.8014	8,934.5016	0,950.001,0	51,250.00

Figure 7.4

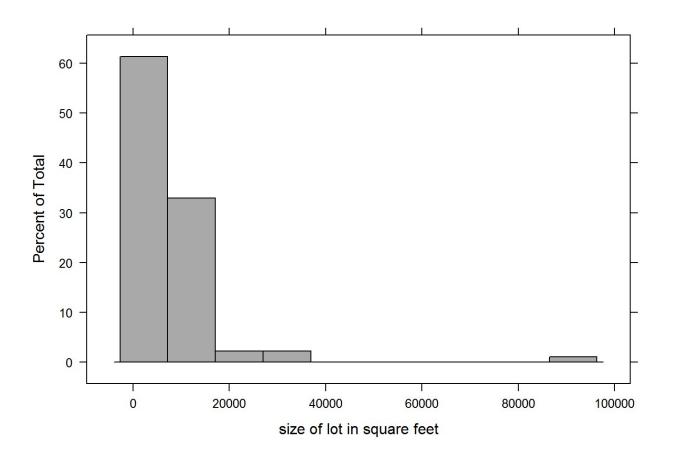


Figure 7.5

```
mod1<-(lm(hprice~bdrms+lotsize+sqrft+colonial))
summary(mod1)</pre>
```

```
##
## Call:
## lm(formula = hprice ~ bdrms + lotsize + sqrft + colonial)
## Residuals:
          1Q Median 3Q Max
    Min
## -177288 -55492 -9490 40904 316158
##
## Coefficients:
##
              Estimate Std. Error t value
                                               Pr(>|t|)
## (Intercept) -34983.4667 42925.0090 -0.815
                                                0.41741
            15956.2241 13797.1276 1.156
## bdrms
                                                 0.25080
## lotsize
                3.0100
                          0.9318 3.230
                                                 0.00177 **
             ## sqrft
## colonial
            19887.5363 21224.0345 0.937
                                                 0.35146
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 86820 on 83 degrees of freedom
## Multiple R-squared: 0.6758, Adjusted R-squared: 0.6602
## F-statistic: 43.25 on 4 and 83 DF, p-value: < 2.2e-16
```

	Dependent variable:
	House price
number of bedrooms	15,956.220
	(13,797.130)
size of lot in square feet	3.010***
	(0.932)
size of house in square feet	180.144***
	(19.340)
=1, if Colonial style	19,887.540
	(21,224.030)
Constant	-34,983.470
	(42,925.010)
Observations	88
R^2	0.676

Adjusted R² 0.660 Residual Std. Error 86,821.600 (df = 83) F Statistic 43.252*** (df = 4; 83) Note: p<0.1; p<0.05; p<0.01

Table 7.7

```
library(psych)
library(xtable)
library(htmlTable)
```

```
f <- function(x) c(obs=length(x), mean=mean(x), sd=sd(x))
tres<-as.matrix(aggregate(hprice ~ bdrms, FUN=c("f")))
colnames(tres)[2:4]<-c("n", "mean", "std. dev.")
htmlTable(txtRound(tres,0))</pre>
```

bdrms n mean std. dev.

- 2 4 364313 57641
- 3 42379870 79965
- 4 33413487 112656
- 5 7 751105 234667
- 6 1 449500
- 7 1 692375

	Dependent variable:
	House price
factor(bdrms)3	15,557.29
	(58,035.40)
factor(bdrms)4	49,174.82
	(58,719.53)
factor(bdrms)5	386,792.70***
	(69,516.20)
factor(bdrms)6	85,187.50
	(124,000.60)
factor(bdrms)7	328,062.50***
	(124,000.60)
Constant	364,312.50***
	(55,454.74)

Observations	88
R^2	0.48
Adjusted R ²	0.45
Residual Std. Error	110,909.50 (df = 82)
F Statistic	14.98*** (df = 5; 82)
Note:	<i>p<0.1; p<0.05; p<0.01</i>

	Dependent variable:					
		house price				
	(1)	(2)	(3)	(4)	(5)	
number of bedrooms	89,935.62***	83,103.63***	22,037.38	20,086.16	15,956.22	
	(16,440.15)	(15,782.56)	(13,751.10)	(13,064.71)	(13,797.13)	
size of lot in square feet		4.14***		3.00***	3.01***	
		(1.31)		(0.93)	(0.93)	
size of house in square feet			186.23***	178.03***	180.14***	
			(20.05)	(19.19)	(19.34)	
=1, if Colonial style					19,887.54	
					(21,224.03)	
Constant	104,735.10*	91,730.25	-28,006.74	-31,566.95	-34,983.47	
	(60,252.24)	(57,448.37)	(45,017.60)	(42,738.81)	(42,925.01)	
Observations	88	88	88	88	88	
R ²	0.26	0.34	0.63	0.67	0.68	
Adjusted R ²	0.25	0.32	0.62	0.66	0.66	
Residual Std. Error	129,022.10 (df =	122,705.00 (df =	91,415.01 (df =	86,758.55 (df =	86,821.61 (df =	
Nesiduai Stu. Liitii	86)	85)	85)	84)	83)	
F Statistic	29.93*** (df = 1;	21.58*** (df = 2;	72.96*** (df = 2;	57.46*** (df = 3;	43.25*** (df = 4;	
I Statistic	86)	85)	85)	84)	83)	

p<0.1; p<0.05; p<0.01

Note:

Table 7.11

names(housing88)

```
mod3<-lm(lprice ~ lsqrft)</pre>
mod4<-lm(lprice ~ colonial)</pre>
mod5<-lm(lprice ~ bdrms + bedsq )</pre>
stargazer(mod3, mod4, mod5, type="html", align=TRUE, no.space=TRUE,
          digits=2, dep.var.labels=c("log of house price"),
            covariate.labels=c("log of built area",
                                "=1, if Colonial style",
                               "number of bedrooms",
                               "beds squared"))
```

	D	ependent variable	:		
	log of house price				
	(1)	(2)	(3)		
log of built area	0.87***				
	(80.0)				
=1, if Colonial style		0.12*			
		(0.07)			
number of bedrooms	3		-0.04		
			(0.19)		
beds squared			0.03		
			(0.02)		
Constant	-0.98	5.55***	5.42***		
	(0.64)	(0.06)	(0.37)		
Observations	88	88	88		
R^2	0.55	0.03	0.23		
Adjusted R ²	0.55	0.02	0.21		
Residual Std. Error	0.20 (df = 86)	0.30 (df = 86)	0.27 (df = 85)		
F Statistic	106.39*** (df = 1; 86	$(6)2.90^{\circ} (df = 1; 86)^{\circ}$	12.41*** (df = 2; 85)		
Note:		p<0	.1; p<0.05; p<0.01		

p<0.1; *p<0.0*5; p<0.01

Teaching Ratings

```
setInternet2(TRUE) # solution for https files

download.file("https://sites.google.com/site/statsr4us/intro/software/rcmdr-1/T
eachingRatings.rda", "TeachingRatings.rda")

load("TeachingRatings.rda")
names(TeachingRatings)
```

```
## [1] "minority" "age" "gender" "credits" "beauty"
## [6] "eval" "division" "native" "tenure" "students"
## [11] "allstudents" "prof"
```

attach(TeachingRatings)

	Dependent variable:				
	teaching evaluation score				
	(1)	(2)	(3)	(4)	
female	-0.17***	-0.16***	-0.15***	-0.18***	
	(0.05)	(0.05)	(0.05)	(0.05)	
minority instructor		-0.03	-0.14 [*]	-0.16**	
		(80.0)	(80.0)	(80.0)	
NON-native English speaker		-0.31***	-0.23**	-0.24**	
		(0.11)	(0.11)	(0.11)	
tenured professor			-0.07	-0.06	
			(0.06)	(0.06)	

Note:				
461)	459)	456)	455)	
10.56*** (df = 1;	6.81^{***} (df = 3;	8.74^{***} (df = 6;	12.03^{***} (df = 7;	
0.55 (df = 461)	0.54 (df = 459)	0.53 (df = 456)	0.51 (df = 455)	
0.02	0.04	0.09	0.14	
0.02	0.04	0.10	0.16	
463	463	463	463	
(0.03)	(0.03)	(0.07)	(0.06)	
4.07***	4.09***	4.11***	4.11***	
			(0.03)	
			0.16***	
			0.16***	
		(0.12)	(0.12)	
		0.53***	0.60***	
		(0.06)	(0.05)	
		0.03	0.01	
	(0.03) 463 0.02 0.02 0.55 (df = 461) 10.56*** (df = 1;	(0.03) (0.03) 463 463 0.02 0.04 0.02 0.04 0.55 (df = 461) 0.54 (df = 459) 10.56*** (df = 1; 6.81*** (df = 3;	(0.06) 0.53**** (0.12) 4.07*** 4.09*** 4.11*** (0.03) (0.03) (0.07) 463 463 463 0.02 0.04 0.10 0.02 0.04 0.09 0.55 (df = 461) 0.54 (df = 459) 0.53 (df = 456) 10.56*** (df = 1; 6.81*** (df = 3; 8.74*** (df = 6; 461) 459) 456)	

p<0.1; *p*<0.05; p<0.01

```
## The following objects are masked from TeachingRatings (pos = 3):
##
## age, allstudents, beauty, credits, division, eval, gender,
## minority, native, prof, students, tenure
##
## Loading required package: zoo
##
## Attaching package: 'zoo'
##
## The following objects are masked from 'package:base':
##
## as.Date, as.Date.numeric
```

```
## Warning: package 'multiwayvcov' was built under R version 3.2.3
```

```
modw1<-lm(eval ~ gender + minority + native + tenure + division +credits + beau</pre>
modw2 < -lm(eval \sim gender + minority + native + tenure + division + credits +
           beauty, weight=weights)
vcov prof <- cluster.vcov(modw2, TeachingRatings$prof)</pre>
# coeftest(modw2, vcov prof)
robust.se <- sqrt(diag(vcov prof))</pre>
stargazer(modw1, modw2, modw2, type="html", align=TRUE, no.space=TRUE,
           se=list(NULL, NULL, robust.se),
          digits=3, dep.var.labels=c("teaching evaluation score"),
          column.labels=c("un-weighted model", "weighted model",
                          "weighted model w/ clustered std. errors"),
          covariate.labels=c("female", "minority instructor",
                              "NON-native English speaker", "tenured professor",
                               "lower division", "single credit",
                               "normalized beauty score",
                               "intercept"))
```

	Dependent variable: teaching evaluation score				
	un-weighted	weighted	weighted model w/ clustered std.		
	model	model	errors		
	(1)	(2)	(3)		
female	-0.178***	-0.184***	-0.184**		
	(0.050)	(0.049)	(0.080)		
minority instructor	-0.158**	-0.171**	-0.171 [*]		
	(0.077)	(0.075)	(0.096)		
NON-native English speaker	-0.236**	-0.212**	-0.212		
	(0.107)	(0.107)	(0.137)		
tenured professor	-0.056	-0.051	-0.051		
	(0.062)	(0.061)	(0.098)		
lower division	0.009	0.061	0.061		
	(0.055)	(0.055)	(0.086)		
single credit	0.603***	0.539***	0.539***		
	(0.117)	(0.113)	(0.157)		
normalized beauty score	0.165***	0.153***	0.153***		
	(0.031)	(0.031)	(0.045)		
intercept	4.115***	4.124***	4.124***		
	(0.063)	(0.063)	(0.098)		
Observations	463	463	463		
R ²	0.156	0.157	0.157		
Adjusted R ²	0.143	0.144	0.144		

Residual Std. Error (df = 0.514 0.443 0.443 0.443 F Statistic (df = 7; 455) 12.032*** 12.088*** 12.088***

p<0.1; *p*<0.05; p<0.01

Expenses

```
## [1] "adults" "alcoh" "food" "kids" "trport" "income" "hhld"
## [8] "nokids" "adult.f" "kids.f" "hhld.f"

## The following object is masked from package:psych:
##
## income
```

Alcohol

Table 7.16

```
stargazer(Dataset, type="html", digits=2)
```

Statistic	N :	Mean	St. Dev.	Min	Max
adults	1,000	1.95	0.59	1	3
alcoh	1,000	30.66	38.00	0.25	762.67
food	1,000	97.26	52.99	20.02	2605.11
kids	1,000	0.82	1.06	0	4
trport	1,000	79.41	90.91	0.03	600.94
income	1,000	662.60	407.22	41	4,437
hhld	1,000	2.78	1.27	1	6
nokids	1,000	0.56	0.50	0	1

```
f <- function(x) c( mean=mean(x), obs=length(x))
tres<-as.matrix(aggregate(alcoh ~ kids.f, FUN=c("f")))
colnames(tres)[1:3]<-c("children in hhld", "mean", "n")
htmlTable(txtRound(tres,1))</pre>
```

children in hh	ldmean n
0.0	32.3 560.0
1.0	28.7 158.0
2.0	30.7 192.0
3.0	23.7 80.0

children in	hhldmean	n
4.0	25.2	10.0

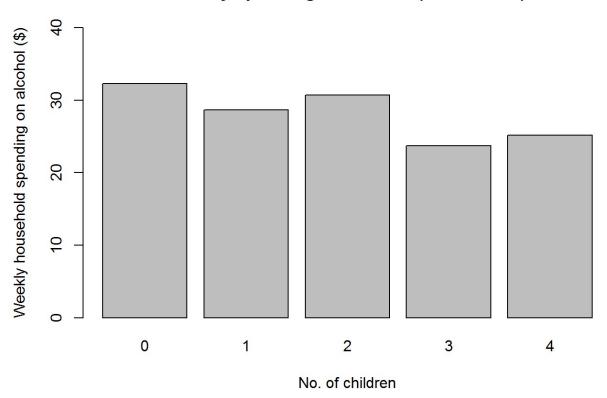
		Dep	endent variable:	
	spending on alcohol			
		alcohol		alcohol, households with children
	(1)	(2)	(3)	(4)
adults in hhld	7.77***	4.64**	4.80**	7.06
	(2.01)	(2.20)	(2.19)	(4.54)
weekly income		0.01***	0.01***	0.01
		(0.003)	(0.003)	(0.01)
children in hhld			-3.05***	-1.18
			(1.13)	(2.65)
Constant	15.47***	14.24***	15.55***	11.68
	(4.11)	(4.10)	(4.12)	(10.84)
Observations	1,000	1,000	1,000	440
R^2	0.01	0.03	0.03	0.01
Adjusted R ²	0.01	0.02	0.03	0.01
Residual Std. Error	37.74 (df = 998)	37.53 (df = 997)	37.42 (df = 996)	42.90 (df = 436)
F Statistic	14.93*** (df = 1; 998)	13.57*** (df = 2; 997)	11.52*** (df = 3; 996)	2.04 (df = 3; 436)
Note:				<i>p<0.1; p<0.05; p<0.01</i>

tres

Figure 7.7

```
barplot(tapply(alcoh, kids, mean), ylim =c(0,40),
    ylab="Weekly household spending on alcohol ($)",
    xlab = "No. of children",
    main="Weekly spending on alcohol (Canadian $)")
```

Weekly spending on alcohol (Canadian \$)



	Dependent variable:
	spending on alcohol
income	0.01***
	(0.003)
factor(adults)2	3.97
	(3.26)
factor(adults)3	10.29**
	(4.43)

factor(kids)1	-6.16 [*]
	(3.42)
factor(kids)2	-5.02
	(3.28)
factor(kids)3	- 10.29**
	(4.56)
factor(kids)4	-6.61
	(11.97)
Constant	21.19***
	(2.94)
Observations	1,000
R ²	0.04
Adjusted R ²	0.03
Residual Std. Error	37.46 (df = 992)
F Statistic	5.16*** (df = 7; 992)
Note:	<i>p<0.1; p<0.05; p<0.01</i>

Food

```
f <- function(x) c( mean=mean(x), obs=length(x))
tres<-as.matrix(aggregate(food ~ kids.f, FUN=c("f")))
colnames(tres)[1:3]<-c("children in hhld", "mean", "n")
htmlTable(txtRound(tres,1))</pre>
```

children in hh	nldmean n
0.0	82.7 560.0
1.0	107.1158.0
2.0	120.9192.0
3.0	120.6 80.0
4.0	118.5 10.0

		Deper	ndent variable:	
	spending on food			
		food		food, households with children
	(1)	(2)	(3)	(4)
adults in hhld	34.73***	20.33***	19.76***	18.18***
	(2.60)	(2.64)	(2.55)	(5.10)
weekly income		0.05***	0.05***	0.04***
		(0.004)	(0.004)	(0.01)
children in hhld			10.86***	7.82***
			(1.32)	(2.98)
Constant	29.41***	23.76***	19.09***	31.25**
	(5.32)	(4.92)	(4.80)	(12.19)
Observations	1,000	1,000	1,000	440
R^2	0.15	0.28	0.32	0.19
Adjusted R ²	0.15	0.28	0.32	0.18
Residual Std. Error	48.85 (df = 998)	45.05 (df = 997)	43.62 (df = 996)	48.24 (df = 436)
F Statistic	177.85*** (df = 1; 998)	192.58*** (df = 2; 997)	159.58*** (df = 3; 996)	33.01*** (df = 3; 436)
Note:				<i>p</i> <0.1; p<0.05; p<0.0

Table 7.22

Dependent variable:
spending on food

income	0.05***
	(0.004)
factor(adults)2	19.84***
	(3.80)
factor(adults)3	38.67***
	(5.17)
factor(kids)1	14.61***
	(3.98)
factor(kids)2	23.99***
	(3.82)
factor(kids)3	30.13***
	(5.31)
factor(kids)4	37.00***
	(13.95)
Constant	38.35***
	(3.43)
Observations	1,000
R^2	0.33
Adjusted R ²	0.32
Residual Std. Error	43.66 (df = 992)
F Statistic	68.50^{***} (df = 7; 992)
Note:	p<0.1; p<0.05; p<0.01

	Depend	Dependent variable:		
	housing price	residuals squared		
	BP Test, original modelBF	BP Test, original modelBP Test, Residual Squared model		
	(1)	(2)		
size of lot in sqr. ft.	3.00***	423,697.70***		

	(0.93)	(149,296.60)
house size in sqr. ft.	178.03***	3,555,405.00
	(19.19)	(3,077,745.00)
number of bedrooms	20,086.16	2,190,300,824.00
	(13,064.71)	(2,094,891,149.00)
Constant	-31,566.95	-11,611,676,039.00 [*]
	(42,738.81)	(6,853,053,027.00)
Observations	88	88
R ²	0.67	0.16
Adjusted R ²	0.66	0.13
Residual Std. Error (df = 84)	86,758.55	13,911,498,783.00
F Statistic (df = 3; 84)	57.46***	5.34***
Note:		<i>p<0.1; p<0.05; p<0.01</i>

```
mod1<-lm(lprice~ llotsize+lsqrft+lnrooms)</pre>
res1 <- resid(mod1)</pre>
res2<-res1^2
mod2 <- lm(res2 ~ llotsize+lsqrft+lnrooms)</pre>
stargazer(mod1, mod2, type="html", align=TRUE, no.space=TRUE,
          digits=2, dep.var.labels=c("log of housing price", "residuals square
d"),
          column.labels=c("BP Test, original model",
          "BP Test, Residual Squared model"),
          covariate.labels=c("size of lot in sqr. ft.", "house size in sqr. f
t.",
                               "number of bedrooms"))
```

	Dependent variable:		
	log of housing price	residuals squared	
	BP Test, original modelBP Test, Residual Squared mo		
	(1)	(2)	
size of lot in sqr. ft.	0.17***	-0.01	
	(0.04)	(0.01)	
house size in sqr. ft.	0.72***	-0.07*	
	(0.09)	(0.04)	
number of bedrooms	0.10	0.07*	
	(0.10)	(0.04)	
Constant	-1.43**	0.50**	
	(0.64)	(0.25)	
Observations	88	88	
R^2	0.64	0.06	

Adjusted R ²	0.63	0.02
Residual Std. Error (df = 84)	0.19	0.07
F Statistic (df = 3; 84)	49.64***	1.65
Note:		<i>p<0.1; p<0.05; p<0.01</i>

	Dependent variable:	
	hpi	rice
	Default SE	Robust SE
	(1)	(2)
size of lot in sqr. ft.	3.00***	3.00^{*}
	(0.93)	(1.81)
house size in sqr. ft.	178.03***	178.03***
	(19.19)	(25.70)
number of bedrooms	20,086.16	20,086.16
	(13,064.71)	(12,294.01)
Constant	-31,566.95	-31,566.95
	(42,738.81)	(53,850.41)
Observations	88	88
R^2	0.67	0.67
Adjusted R ²	0.66	0.66
Residual Std. Error (df = 84)	86,758.55	86,758.55
F Statistic (df = 3; 84)	57.46***	57.46***
Note:	p<0.1; p<0	0.05; p<0.01

	Dependent variable:		
	hprice		
	beds	beds+sqrft	beds+sqrft+lotsize
	(1)	(2)	(3)
number of bedrooms	89,935.62***	22,037.38	20,086.16
	(16,440.15)	(13,751.10)	(13,064.71)
house size in sqr. ft.		186.23***	178.03***
		(20.05)	(19.19)
size of lot in sqr. ft.			3.00***
			(0.93)
Constant	104,735.10*	-28,006.74	-31,566.95
	(60,252.24)	(45,017.60)	(42,738.81)
Observations	88	88	88
R ²	0.26	0.63	0.67
Adjusted R ²	0.25	0.62	0.66
Residual Std. Error	129,022.10 (df = 86)91,415.01 (df = 85)86,758.55 (df = 84)		
F Statistic	29.93*** (df = 1; 86) 72.96*** (df = 2; 85)57.46*** (df = 3; 84)		
Note:	<i>p<0.1; p<0.05; p<0.01</i>		