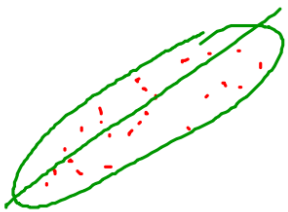


Sec 12.1

## Inference For Regression

- Is there a linear association between 2 quantitative variables in a population?
- First, need to know if there is a linear relationship between 2 quantitative variables from a random sample ...

Given 2 (x,y) variables, is there a linear relationship?



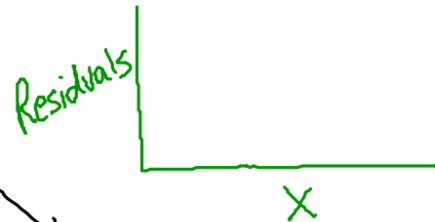
Scatterplot



Correlation (Lin Reg  $a + bx$ )



Residual Plot



No Pattern / Random



Pattern / Not Random

Linear Model  $\hat{y} = a + bx$

No Linear Model

$$\hat{y} = a + bx$$

## LINEAR REGRESSION T TEST

*This test is used to determine if there is a linear relationship between 2 quantitative variables in a population*

Child development researchers explored the relationship between the crying of infants 4 to 10 days old and their later IQ scores. The number of peaks in the most active 20 seconds of crying were counted and recorded. The tables contain data from a random sample of 36 infants.

Cry	10	12	9	16	18	15	12	20	16	33	20	16
IQ	87	97	103	106	109	114	119	132	136	159	90	100

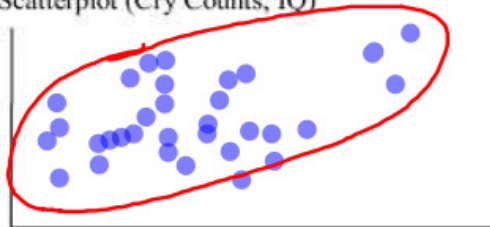
Cry	23	27	15	21	12	15	17	17	19	13	18	18
IQ	103	108	112	114	120	133	141	94	103	104	109	112

Cry	16	19	22	30	12	12	14	10	23	9	16	31
IQ	118	120	135	155	94	103	106	109	113	119	124	135

Do these data provide convincing evidence of a linear relationship between crying counts and IQ in the population of infants 4 to 10 days old?

### DETERMINE IF THERE IS A LINEAR RELATIONSHIP FROM THE SAMPLE

- 1) Scatterplot (Cry Counts, IQ)

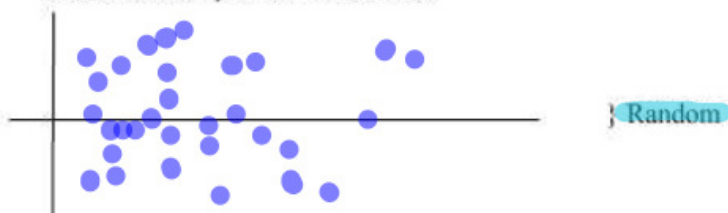


- 2) Calculate  $r$  and LSRL

$r = .5455$  (moderately weak positive linear relationship)

$$\hat{y} = 87.91 + 1.55x \rightarrow \overset{\wedge}{\text{IQ}} = 87.91 + 1.55(\text{Cry Count})$$

- 3) Check residual plot for randomness



**PERFORM TEST:**

**P) STATE POPULATION PARAMETER:**

$\beta$  = true slope of population regression line determined by crying counts and IQ

**H) STATE HYPOTHESES:**

$H_0: \beta = 0$

$H_a: \beta \neq 0$

**A) VERIFY ASSUMPTIONS REQUIRED FOR TEST:**

Linear- moderately strong linear relationship exists with a random residual plot

Independent- IQs independent and  $N > 10(36) > 360$  infants

Normal (Residuals)- NPP of residuals linear and  $n > 30$

Equal variance- residuals equally scattered around  $x = 0$

Random- random sample taken

**T) PERFORM TEST:**

a) Using Formula:

$$t = \frac{b}{SE_b} \text{ with } df = n - 2 \text{ where } SE_b = \frac{\sqrt{\frac{\sum(y_i - \hat{y})^2}{n - 2}}}{\sqrt{\sum(x_i - \bar{x})^2}}$$

b) Using Minitab Output?

Predictor	Coef	SE Coef	T	P
Constant	87.9055	8.934	10.22	0.0000
Crycount	1.5517	0.4094	3.79	0.0005
s = 14.25		R-Sq = 29.8%		R-Sq (adj) = 28.5%

c) Using Calculator:

STAT → TESTS → Lin Reg T Test →  $t = 3.79$ ,  $P\text{-value} = .0005$

**S) STATE CONCLUSION:**

At  $\alpha = .05$ , there is strong evidence to reject  $H_0$  and conclude a linear relationship exists between crying and IQ in the population of infants

**CONFIDENCE INTERVAL**

A 99% confidence interval for the true population slope can be found using:

a) Formula:

$$CI = b \pm t^* SE_b = 1.55 \pm (2.750)(.4094) = (.43, 2.66)$$

Table B       $SE_b = \frac{b}{t}$

b) Calculator?

STAT → TESTS → Lin Reg T Interval = (.43, 2.66)

*We are 99% confident that for every cry count, IQ increases between .43 and 2.66 points*

**Calculator Note:**

$H_0: \beta = 0$

$H_0: \rho = 0$

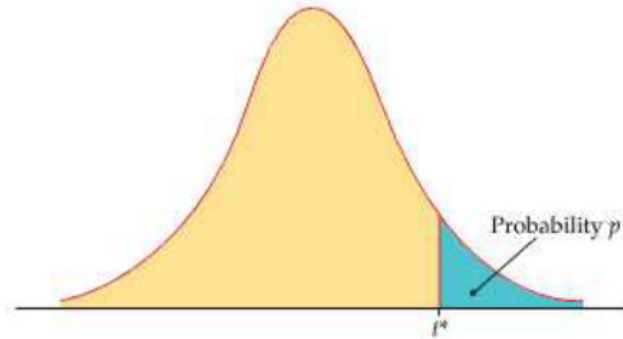
If  $\beta = 0$ ,  $\rho = 0$

$\beta > 0$ ,  $\rho > 0$

$\beta < 0$ ,  $\rho < 0$

↑  
rho (population correlation)

Table entry for  $p$  and  $C$  is the critical value  $t^*$  with probability  $p$  lying to its right and probability  $C$  lying between  $-t^*$  and  $t^*$ .



**TABLE D**

**t distribution critical values**

df	Upper-tail probability $p$											
	.25	.20	.15	.10	.05	.025	.02	.01	.005	.0025	.001	.0005
1	1.000	1.376	1.963	3.078	6.314	12.71	15.89	31.82	63.66	127.3	318.3	636.6
2	0.816	1.061	1.386	1.886	2.920	4.303	4.849	6.965	9.925	14.09	22.33	31.60
3	0.765	0.978	1.250	1.638	2.353	3.182	3.482	4.541	5.841	7.453	10.21	12.92
4	0.741	0.941	1.190	1.533	2.132	2.776	2.999	3.747	4.604	5.598	7.173	8.610
5	0.727	0.920	1.156	1.476	2.015	2.571	2.757	3.365	4.032	4.773	5.893	6.869
6	0.718	0.906	1.134	1.440	1.943	2.447	2.612	3.143	3.707	4.317	5.208	5.959
7	0.711	0.896	1.119	1.415	1.895	2.365	2.517	2.998	3.499	4.029	4.785	5.408
8	0.706	0.889	1.108	1.397	1.860	2.306	2.449	2.896	3.355	3.833	4.501	5.041
9	0.703	0.883	1.100	1.383	1.833	2.262	2.398	2.821	3.250	3.690	4.297	4.781
10	0.700	0.879	1.093	1.372	1.812	2.228	2.359	2.764	3.169	3.581	4.144	4.587
11	0.697	0.876	1.088	1.363	1.796	2.201	2.328	2.718	3.106	3.497	4.025	4.437
12	0.695	0.873	1.083	1.356	1.782	2.179	2.303	2.681	3.055	3.428	3.930	4.318
13	0.694	0.870	1.079	1.350	1.771	2.160	2.282	2.650	3.012	3.372	3.852	4.221
14	0.692	0.868	1.076	1.345	1.761	2.145	2.264	2.624	2.977	3.326	3.787	4.140
15	0.691	0.866	1.074	1.341	1.753	2.131	2.249	2.602	2.947	3.286	3.733	4.073
16	0.690	0.865	1.071	1.337	1.746	2.120	2.235	2.583	2.921	3.252	3.686	4.015
17	0.689	0.863	1.069	1.333	1.740	2.110	2.224	2.567	2.898	3.222	3.646	3.965
18	0.688	0.862	1.067	1.330	1.734	2.101	2.214	2.552	2.878	3.197	3.611	3.922
19	0.688	0.861	1.066	1.328	1.729	2.093	2.205	2.539	2.861	3.174	3.579	3.883
20	0.687	0.860	1.064	1.325	1.725	2.086	2.197	2.528	2.845	3.153	3.552	3.850
21	0.686	0.859	1.063	1.323	1.721	2.080	2.189	2.518	2.831	3.135	3.527	3.819
22	0.686	0.858	1.061	1.321	1.717	2.074	2.183	2.508	2.819	3.119	3.505	3.792
23	0.685	0.858	1.060	1.319	1.714	2.069	2.177	2.500	2.807	3.104	3.485	3.768
24	0.685	0.857	1.059	1.318	1.711	2.064	2.172	2.492	2.797	3.091	3.467	3.745
25	0.684	0.856	1.058	1.316	1.708	2.060	2.167	2.485	2.787	3.078	3.450	3.725
26	0.684	0.856	1.058	1.315	1.706	2.056	2.162	2.479	2.779	3.067	3.435	3.707
27	0.684	0.855	1.057	1.314	1.703	2.052	2.158	2.473	2.771	3.057	3.421	3.690
28	0.683	0.855	1.056	1.313	1.701	2.048	2.154	2.467	2.763	3.047	3.408	3.674
29	0.683	0.854	1.055	1.311	1.699	2.045	2.150	2.462	2.756	3.038	3.396	3.659
30	0.683	0.854	1.055	1.310	1.697	2.042	2.147	2.457	2.750	3.030	3.385	3.646
40	0.681	0.851	1.050	1.303	1.684	2.021	2.123	2.423	2.704	2.971	3.307	3.551
50	0.679	0.849	1.047	1.299	1.676	2.009	2.109	2.403	2.678	2.937	3.261	3.496
60	0.679	0.848	1.045	1.296	1.671	2.000	2.099	2.390	2.660	2.915	3.232	3.460
80	0.678	0.846	1.043	1.292	1.664	1.990	2.088	2.374	2.639	2.887	3.195	3.416
100	0.677	0.845	1.042	1.290	1.660	1.984	2.081	2.364	2.626	2.871	3.174	3.390
1000	0.675	0.842	1.037	1.282	1.646	1.962	2.056	2.330	2.581	2.813	3.098	3.300
$z^*$	0.674	0.841	1.036	1.282	1.645	1.960	2.054	2.326	2.576	2.807	3.091	3.291
	50%	60%	70%	80%	90%	95%	96%	98%	99%	99.5%	99.8%	99.9%
Confidence level $C$												

Sec 12.2



# Making Predictions



Linear Model

$$\hat{y} = a + bx$$

Exponential Model

$$\hat{y} = ab^x$$

Power Model

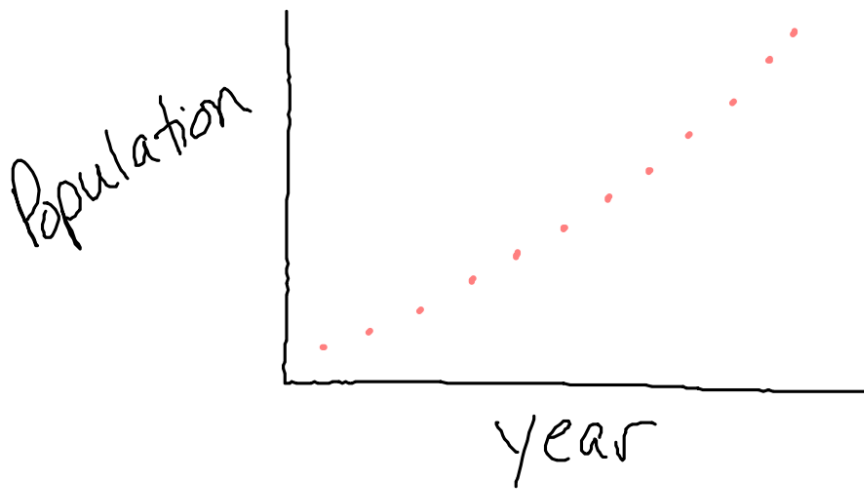
$$\hat{y} = ax^b$$

Find a model to predict population in 2010:

<u>year</u> (x)	<u>US Pop</u> (y)
1920	105.7
1930	122.8
1940	131.7
1950	151.3
1960	179.3
1970	203.3
1980	226.5
1990	248.7
2000	281.4

Begin with a linear model ...

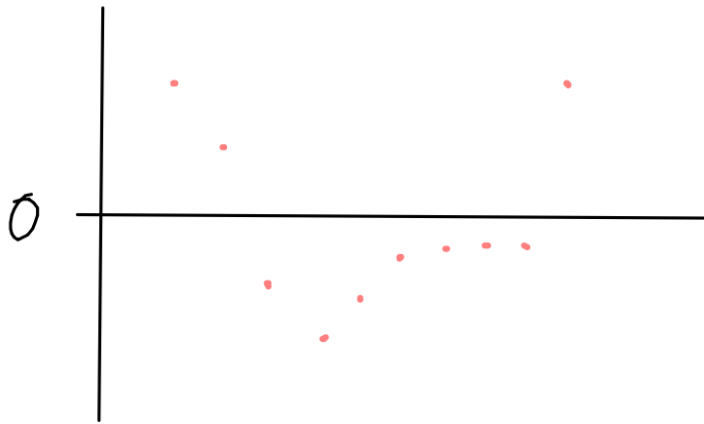
1) Scatterplot ( $L_1, L_2$ )



2) Calculate Correlation ( $L_1, L_2$ )

$$r = .9928$$

3) Create residual plot ( $L_1$ , RESID)



NOT random...  
linear model  
no good fit

See If An Exponential Model "Works" ...

i) Create new list

L<sub>1</sub>

X

L<sub>2</sub>

Y

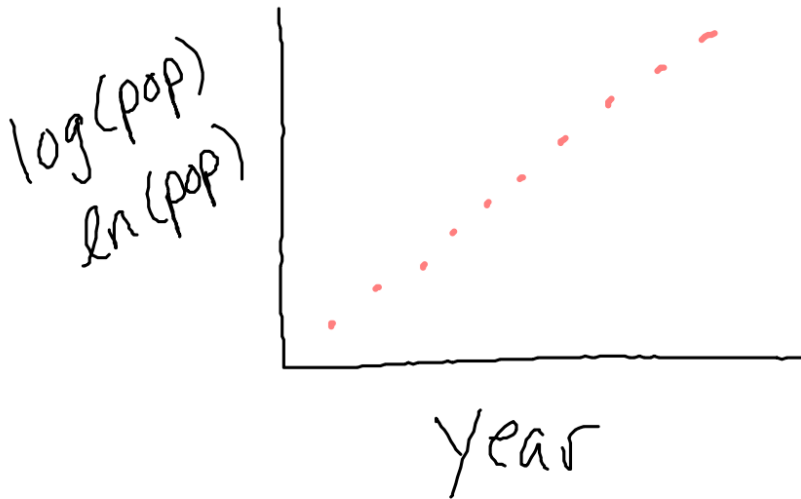
L<sub>3</sub>

log y

ln y

} Either

## 2) Scatterplot ( $L_1$ , $L_3$ )

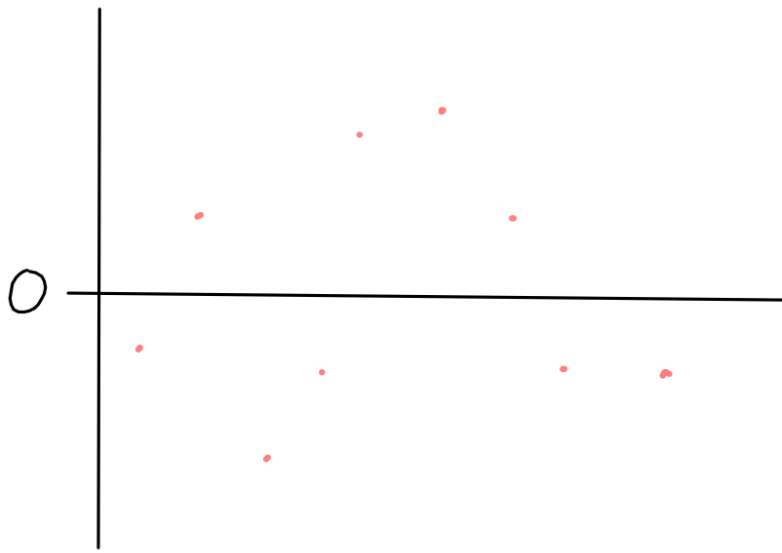


## \* 3) Linear Regression ( $L_1$ , $L_3$ )

$$r = .9976$$



4) Create New Residual Plot ( $L_1$ , RESID)



} Random ☺  
exponential  
model  
appropriate

5) Write Exponential Model

$$y = ab^x$$

## a) Transform Linear Equation

$$\begin{array}{c} \log y \\ \swarrow \\ \hat{y} = -8.28 + .005x \end{array}$$

↓ Really

$$\log \hat{y} = -8.28 + .005x$$

$$\hat{y} = 10^{-8.28 + .005x}$$

$$\hat{y} = (10^{-8.28})(10^{.005x})$$

$$\begin{array}{c} \ln y \\ \swarrow \\ \hat{y} = -19.06 + .0124x \end{array}$$

↓ Really

$$\ln \hat{y} = -19.06 + .0124x$$

$$\hat{y} = e^{-19.06 + .0124x}$$

$$\hat{y} = (e^{-19.06})(e^{.0124x})$$

$$\hat{Pop} = (5.3 \times 10^{-9})(1.01)^{\text{year}}$$

b) Use Calculator?

STAT → CALC → ExpReg (L<sub>1</sub>, L<sub>2</sub>)

$$\hat{Pop} = (5.29 \times 10^{-9})(1.01)^{\text{Year}}$$

Making Predictions - Use model to predict population in 2010 > 309.3M

i) Plug'n Chug (Use log/ln form w/out rounding)

$$a) \log \hat{\text{pop}} = - \underline{8.276051195} + \underline{.0053661533} (\text{year})^{2010}$$

$$\log \hat{\text{pop}} = 2.509916943$$

$$\hat{\text{pop}} = 10^{2.509916943} = 323.5 \text{ M}$$

$$b) \ln \hat{\text{pop}} = -19.05631211 + .0123560246 (\overset{2010}{\cancel{\text{Year}}})$$

$$\ln \hat{\text{pop}} = 5.779297336$$

$$\hat{\text{pop}} = e^{5.779297336} = 323.5 \text{ M}$$

## 2) Using Calculator

a) Store LSRL when calculating

$$\text{CALC} \rightarrow \text{LinReg } L_1, L_3, Y_1$$

b) Define  $Y_2$

$$Y_2 = 10 \wedge Y_1 \quad Y_2 = e \wedge Y_1$$

c) Use VARS to enter X-value

$$Y_2(2010) = 323.5 \text{ M}$$

## 2) Using Calculator

a) Store ExpReg When Calculating

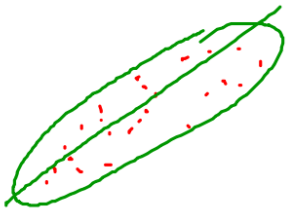
CALC  $\rightarrow$  ExpReg L1, L2, Y1

b) Use VARS to enter X-value

$$Y_1(2010) = 323.5M$$



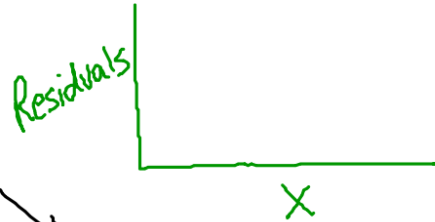
Given 2 (x,y) variables, is there an exponential relationship?



Scatterplot (x, log y)

↓  
Correlation (Lin Reg  $a+bx$ )

↓  
Residual Plot



↙ No Pattern / Random

Exponential Model ÷

$$\hat{y} = ab^x$$

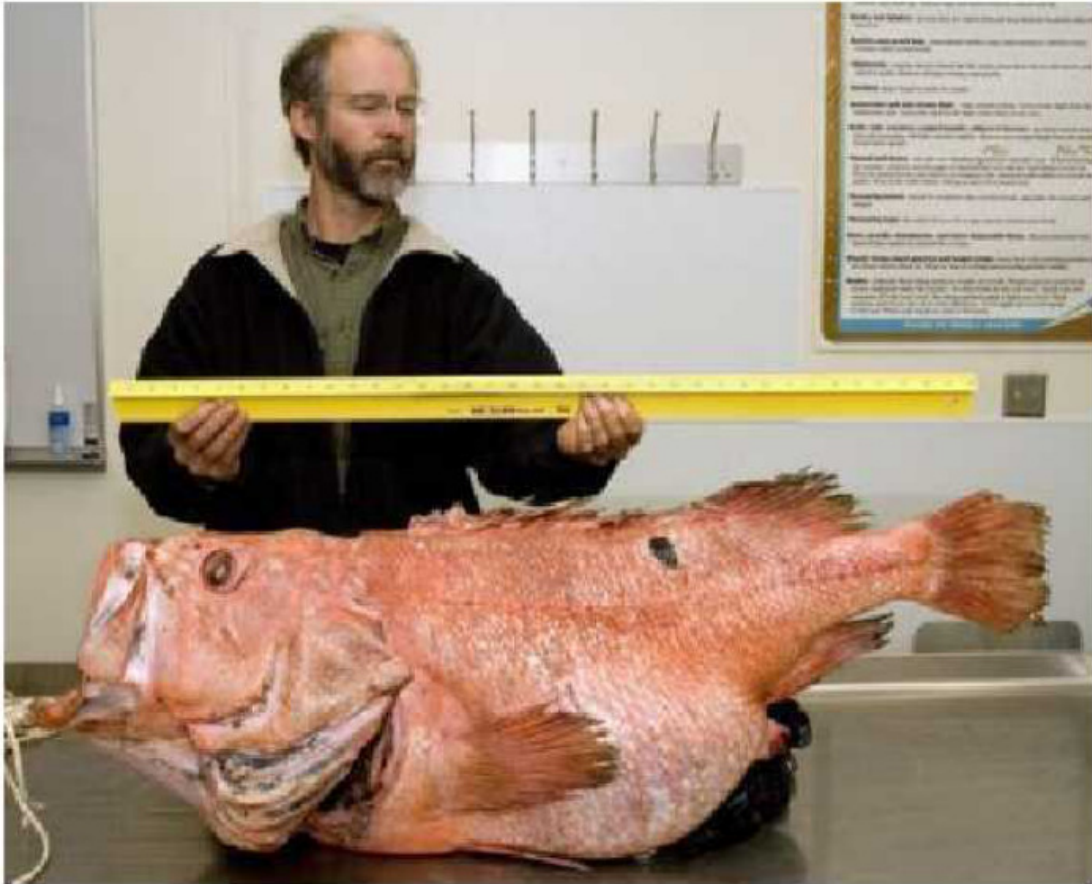
↘ Pattern / Not Random

No Exponential Model ÷

Sec 12.2 cont

(Power Regression)

## ROCKFISH



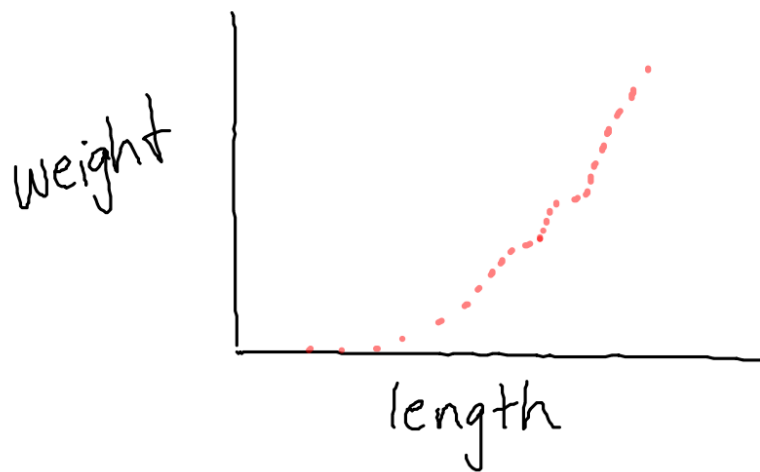
$L_1$   $L_2$

Age (yr)	Length (cm)	Weight (g)	Age (yr)	Length (cm)	Weight (g)
1	5.2	2	11	28.2	318
2	8.5	8	12	29.6	371
3	11.5	21	13	30.8	455
4	14.3	38	14	32.0	504
5	16.8	69	15	33.0	518
6	19.2	117	16	34.0	537
7	21.3	148	17	34.9	651
8	23.3	190	18	36.4	719
9	25.0	264	19	37.1	726
10	26.7	293	20	37.7	810

Find a model to predict the weight of a rockfish given its length

Begin with a linear model...

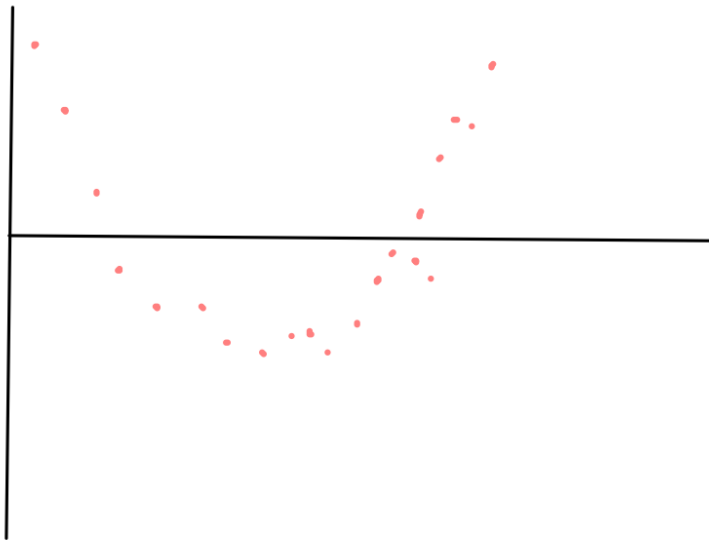
1) Scatterplot ( $L_1, L_2$ )



2) Calculate Correlation

$$r = .9461$$

### 3) Create Residual Plot ( $L_1$ , RESID)



} Pattern...  
Linear Model  
No Good is

See If An Exponential Model Works...

i) Create new list

L<sub>1</sub>

x

L<sub>2</sub>

y

L<sub>3</sub>

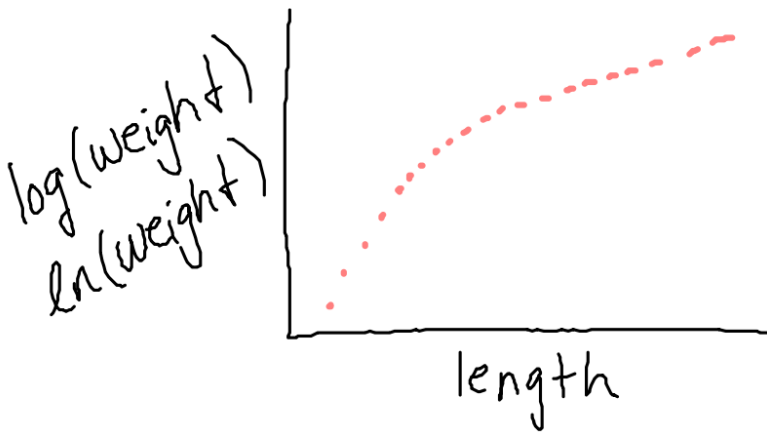
log y

ln y

} Either



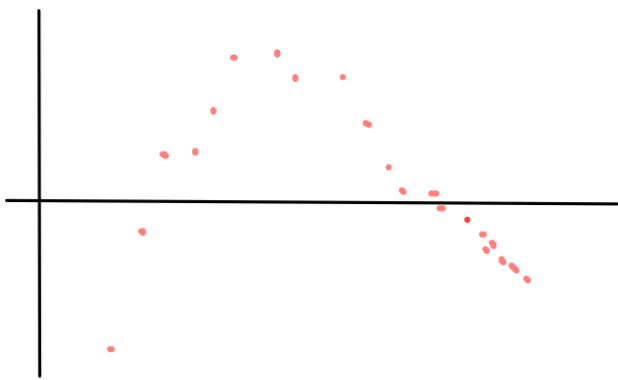
2) Scatterplot ( $L_1$ ,  $L_3$ )



3) Calculate Correlation ( $L_1$ ,  $L_3$ )

$$r = .963$$

4) Create Residual Plot ( $L_1$ , RESID)



} Pattern ...  
Exponential Model  
No Good fit

See IF A Power Model Works ...

i) Create another new list

L<sub>1</sub>

X

L<sub>2</sub>

Y

L<sub>3</sub>

log Y

ln Y

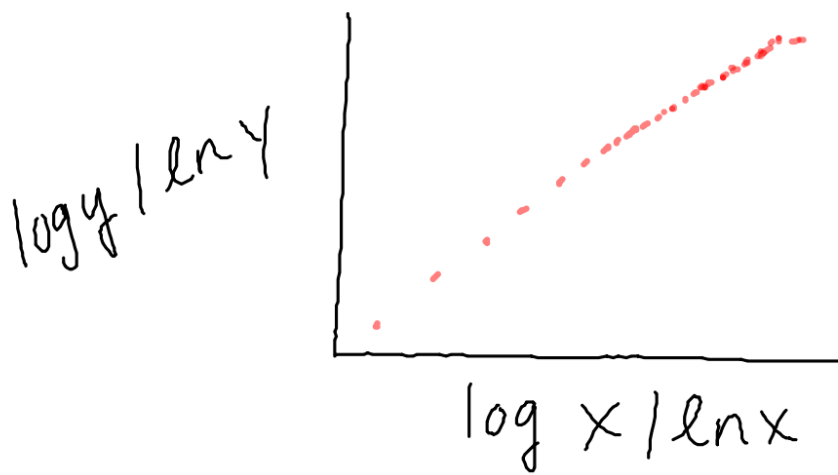
L<sub>4</sub>

log X

ln X

} Either

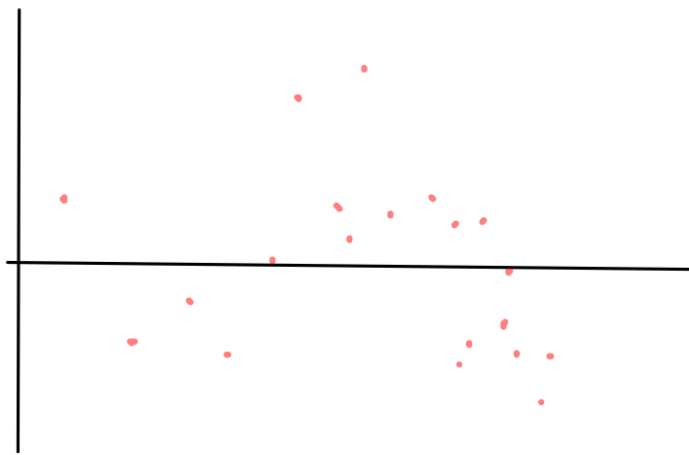
2) Scatterplot ( $L_4, L_3$ )



3) Calculate Correlation ( $L_4, L_3$ )

$$r = .999$$

4) Create Residual Plot (L4, RESID)



} Random ...  
Power Model  
Best

5) Write Power Model ( $y = ax^b$ )

log ↙

$$\hat{y} = -1.8994 + 3.0494x$$

Really ↓

$$\log \hat{y} = -1.8994 + 3.0494(\log x)$$

$$\hat{y} = (10^{-1.8994})(x^{3.0494})$$

ln ↘

$$\hat{y} = -4.3735 + 3.0494x$$

Really ↓

$$\ln \hat{y} = -4.3735 + 3.0494(\ln x)$$

$$\hat{y} = (e^{-4.3735})(x^{3.0494})$$

$$\hat{\text{Weight}} = (.0126)(\text{length})^{3.0494}$$

Making Predictions - Find weight if length is 24cm

1) Plug 'n Chug (Use log/ln form without rounding)

$$\begin{aligned} \text{a) } \log \hat{y} &= -1.8994 + 3.0494 (\log x) = 2.30941616 \\ \hat{\text{weight}} &= 10^{2.30941616} = 204 \text{ g} \end{aligned}$$

$$\begin{aligned} \text{b) } \ln \hat{y} &= -4.3735 + 3.0494 (\ln x) = 5.31765735 \\ \hat{\text{weight}} &= e^{5.31765735} = 204 \text{ g} \end{aligned}$$



2) Using calculator

a) Let  $Y_1 = \text{LSRL}(L_4, L_3)$

b) Define  $Y_2 = (10 \wedge a)(x \wedge b)$  or  $(e \wedge a)(x \wedge b)$

X, T, G  
↓  
↑                      ↑

VARS → 5: Statistics → EQ

c) VARS → Y-VARS → Function →  $Y_2(24) = 204g$

## Notes

1) Using CALC → PwrReg  $L_1, L_2$  may not work

↑  
overflow  
error?

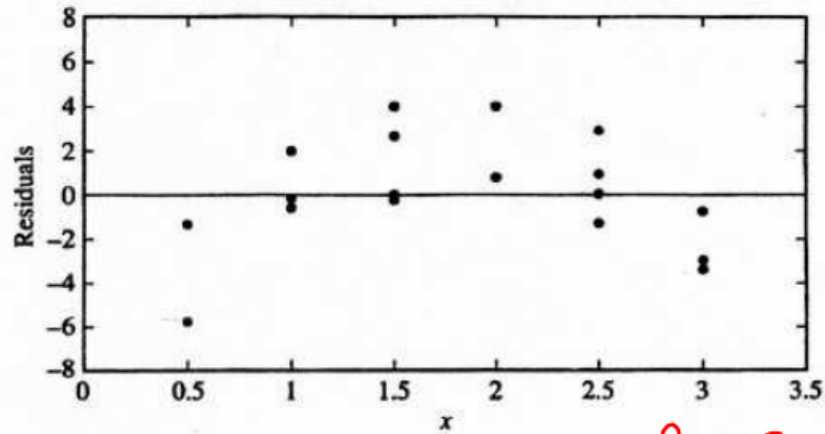
2) Not a lot of these calculations on AP Exam...

See MC Example (next page)

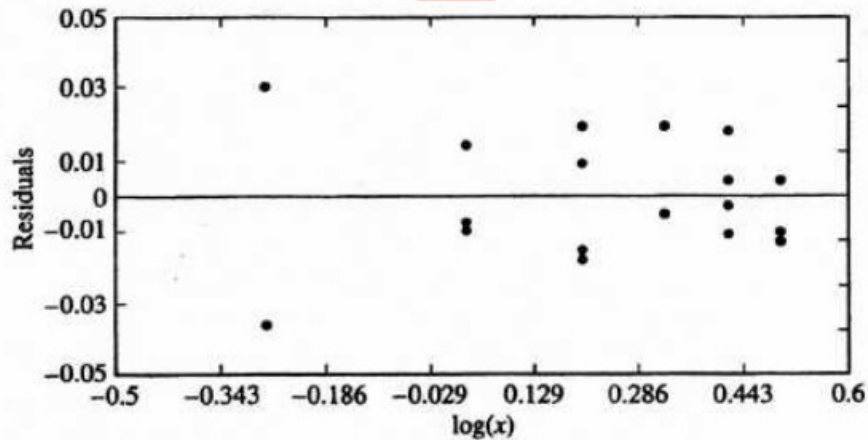
28. Two measures  $x$  and  $y$  were taken on 18 subjects. The first of two regressions, Regression I, yielded

$$\hat{y} = 24.5 + 16.1x$$

↑  
Linear



The second regression, Regression II, yielded  $\widehat{\log(y)} = 1.6 + 0.51 \log(x)$  and had the following residual plot.

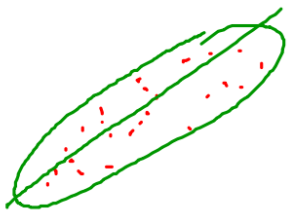


> More  
Random

Which of the following conclusions is best supported by the evidence above?

- (A) There is a linear relationship between  $x$  and  $y$ , and Regression I yields a better fit.
- (B) There is a linear relationship between  $x$  and  $y$ , and Regression II yields a better fit.
- (C) There is a negative correlation between  $x$  and  $y$ .
- (D) There is a nonlinear relationship between  $x$  and  $y$ , and Regression I yields a better fit.
- (E) There is a nonlinear relationship between  $x$  and  $y$ , and Regression II yields a better fit.

Given 2 (x,y) variables, is there a power relationship?



Scatterplot ( $\log x, \log y$ )

↓  
Correlation (Lin Reg  $a+bx$ )

↓  
Residual Plot



↙ No Pattern / Random

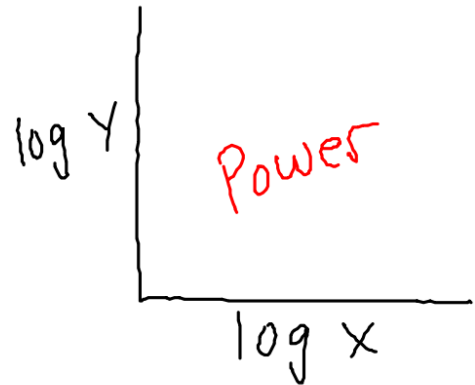
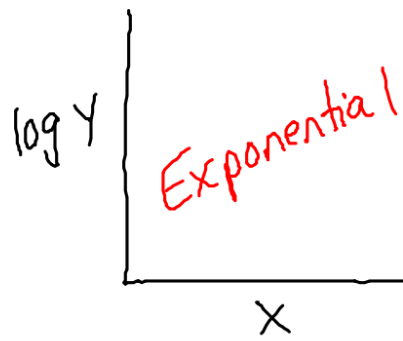
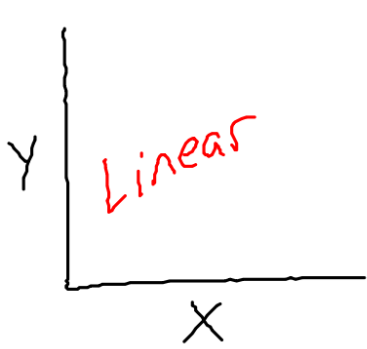
Power Model is

$$\hat{y} = ax^b$$

↘ Pattern / Not Random

No Power Model is

# Review



# Note

There are other models!



Logistic  
Regression

$$\hat{y} = \frac{c}{1 + ae^{-bx}}$$