

Quiz #2

Jan. 27, 2017

20/13

Below, we fit a simple linear regression **model1**:

$$\text{model1: } y_i = \beta_0 + \beta_1 x_i + \varepsilon_i, \text{ where } \varepsilon_i \sim \text{normal}(0, \sigma^2)$$

```
> data1 <- read.csv("U:\\STAT510\\lizards.csv")
> dim(data1)
[1] 80 3
> head(data1)
      x      y
1 0.3880 0.1073
2 0.4003 0.0700
3 0.3233 0.0655
4 0.3316 0.0716
5 0.3254 0.1703
6 0.3331 0.0885
> attach(data1)
> model1 <- lm(y~x)
> summary(model1)
```

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	-0.04158	0.00806	-5.159	< 0.001 ***
JAWL	0.52456	0.03109	16.872	< 0.001 ***

Residual SE: 0.04285 on 78 degrees of freedom

R-squared: 0.7849, Adjusted R-squared: 0.7822

F-statistic: 284.7 on 1 and 78 DF, p-value: < 0.001

```
> anova(model1)
```

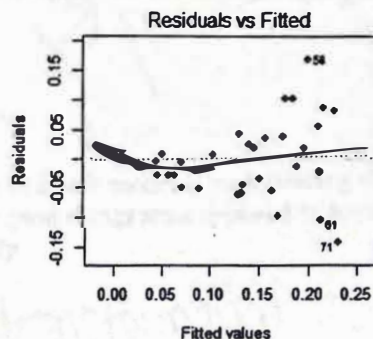
Analysis of Variance Table

Response: BVOL

	Df	Sum Sq	Mean Sq	F value	Pr(>F)
JAWL	1	0.52278	0.52278	284.65	< 0.001 ***
Residuals	78	0.14325	0.00184		

TOTAL 79 0.66603 #This was added by the instructor.

```
> plot(model1) #This creates 4 plots. Only the first one is shown.
```



(a) In the diagnostic plot shown above, y-axis = residuals, x-axis = predicted values. Does the plot look satisfactory? If NOT, explain briefly what the problem is.

No, there is a megaphone shape, meaning that it doesn't meet the assumption of homogeneity of variance.

```
> logLik(model1)
```

'log Lik.' 139.4926 (df=3)

(4) (b) You must have an assumption about the distribution of the errors in order to calculate (log) Likelihood. What is the default distribution that's being assumed when R calculates the (log) likelihood?

Normal distribution

(c) Calculate the AIC value of model1. Showing "set up" (with numbers) is enough.

Hint: $AIC = -2 \cdot \log \text{Likelihood} + 2(p+1)$.

$$-2 \cdot (139.4926) + 2(3+1)$$

p=2
not 3

(d) Calculate the AICc value of model1. Showing "set up" (with numbers) is enough.

Hint: $AICc = AIC + \frac{2(p+1)(p+2)}{n-p}$.

$$-2 \cdot (139.4926) + 2(3+1) + \frac{2(3+1)(3+2)}{80-3}$$

(e) Theory says to use AICc when $\frac{n}{p+1} < 40$. With model1,

which one should we use: AIC or AICc?

$$\frac{80}{3+1} < 40$$

$$\frac{80}{4} < 40$$

Quiz #2 (Keys)

- (a) NO it's NOT satisfactory. There is a heterogeneous variance!
(* This can be fixed by the Box-Cox- transformation).
- (b) Normal distribution
- (c) $AIC = (-2 \times 139.4926) + (2 \times 3) = -272.9852$
- (d) $AIC_c = -272.9851 + ((2 \times 3 \times 4) / (80 - 2)) = -272.67$
- (e) AIC_c because $80 \div 3 < 40$

model1)

139.4926

an assumption about
order to calculate (log
distribution that's being
(log) likelihood?

distribution

AIC value of model1. Sh
s) is enough.

$2 \cdot \log \text{Likelihood} + 2(p$

$39.4926) + 2(3)$

AIC_c value of model1. Sh
s) is enough.

Quiz #3

Feb. 3, 2017

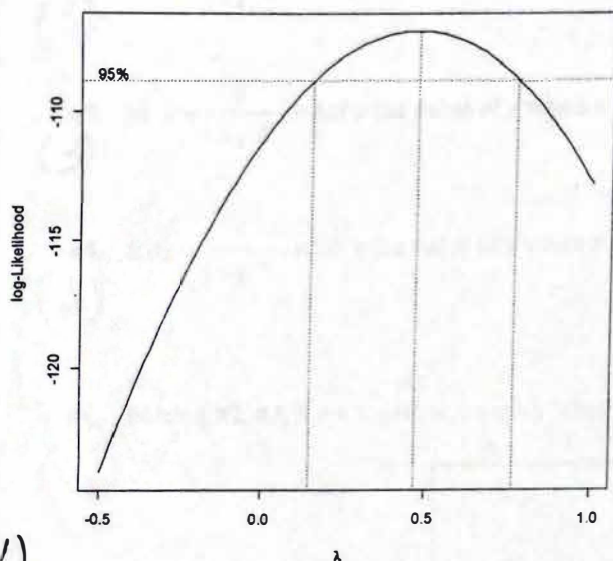
20 pts

12/20

Below, we fit a simple linear regression **model1**:

model1: $y_i = \beta_0 + \beta_1 x_i + \varepsilon_i$, where $\varepsilon_i \sim \text{normal}(0, \sigma^2)$

```
> data1 <- read.csv("U:\\STAT510\\sampledata1.csv")
> attach(data1)
> model1 <- lm(y~x)
> boxcox(model1)
```



(a) According to the Box-Cox plot, what kind of "action" is appropriate here?

~~log~~ -4

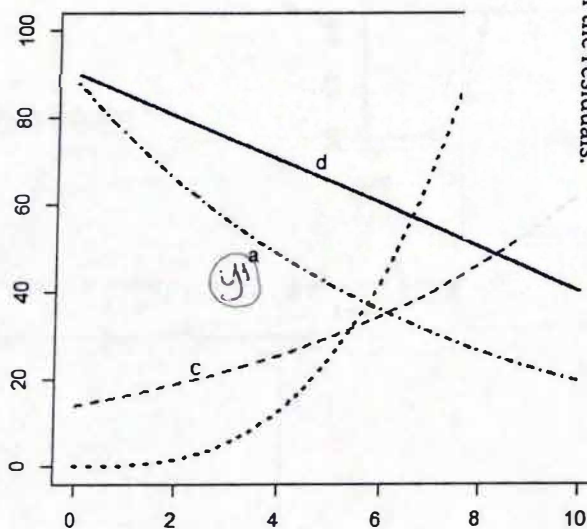
(b) If you fit a new model after following the advice in (a), what good things are supposed to happen? Explain briefly.

the transformation should normalize the resids. (homo-
geneity of variance)

The following four curves are plotted on a single graphing window as shown below.

- a $y_1 = 88e^{-0.15x}$
- d $y_2 = 90 - 5x$
- b $y_3 = 0.2x^3$
- c $y_4 = 14e^{0.15x}$

- (a) Transform y by square root, i.e., \sqrt{y}
- (b) Stabilizes the variance of the residuals.
- (c) 0
- (d) a
- (e) b because at $x=0, y=0$.



(c) $\lim_{x \rightarrow \infty} y_1 = ?$ That is, as $x \rightarrow \infty$, where does $88e^{-0.15x}$ go to?

~~20~~ "0" -4

(d) Continuing from (c), which of the four plots would be the graph of y_1 ? Choose one from a, b, c & d.

a ✓

(e) Which of the four plots would be the graph of y_3 ? Why? Choose one from a, b, c & d.

b, because the line starts at 0, 2 & follows a x^3 curve.

Quiz #3 (Keys)

Quiz #3 (Keys)

12/20
residuals are plotted on a single graphing

now.

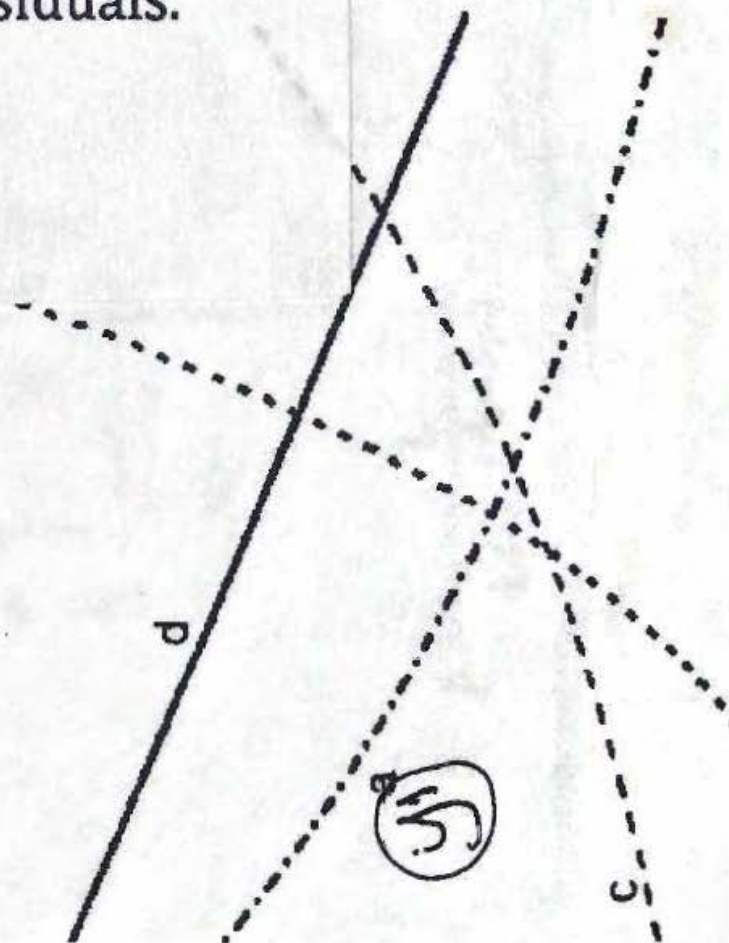
$y_1 = 88e^{-0.15x}$

$y_2 = 90 - 5x$

$y_3 = 0.2x^3$

$y_4 = 14e^{0.15x}$

- (a) Transform y by square root, i.e., \sqrt{y}
- (b) Stabilizes the variance of the residuals.
- (c) 0
- (d) a
- (e) b because at $x=0, y=0$.



Quiz #4

Feb. 10, 2017

20 pts

U558 M

#1. Which of the following is the same expression as $y = \frac{e^{\beta_0 + \beta_1 x}}{1 + e^{\beta_0 + \beta_1 x}}$?

(3)

(a) $y = \frac{1}{1 + e^{\beta_0 + \beta_1 x}}$

(b) $y = \frac{1}{1 + e^{-(\beta_0 + \beta_1 x)}}$ ✓

(c) $y = \frac{1}{e^{\beta_0 + \beta_1 x} - 1}$

(d) $y = \frac{1}{e^{-(\beta_0 + \beta_1 x)} - 1}$

#2. In $y = \frac{1}{1 + e^{-x}}$, what's the value of y when $x = 0$?

(3)

1/2 ✓

#3. In $y = \frac{1}{1 + e^{-x}}$, what's the value of y when $x = \infty$?

(3)

1 ✓

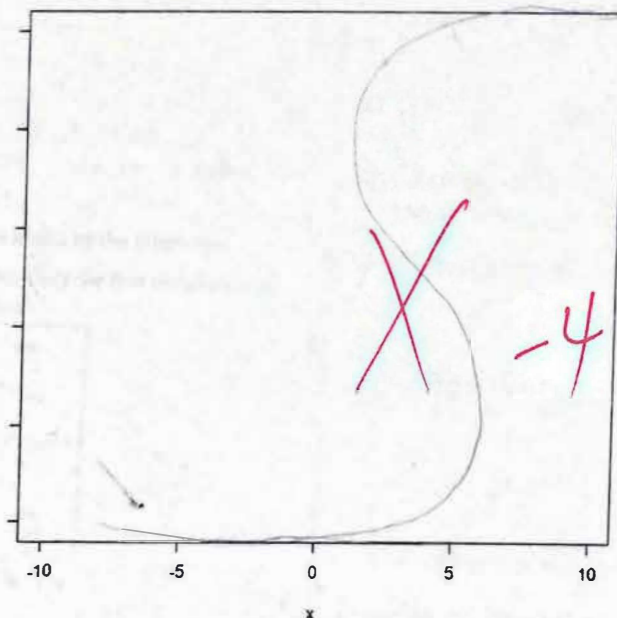
#4. In $y = \frac{1}{1 + e^{-x}}$, what's the value of y when $x = -\infty$ (i.e., minus infinity)?

(3)

0 ✓

#5. Putting #2, #3, & #4 together, roughly "sketch" the graph of $y = \frac{1}{1 + e^{-x}}$.

(4)



#6. Consider $\log\left(\frac{p}{1-p}\right) = \beta_0 + \beta_1 x$. Rewrite this expression in terms of p .

(4)

~~$\frac{p}{1-p} = \beta_0 + \beta_1 x$~~
log

~~X~~

~~$\hat{p} = \frac{1}{1 + e^{-(\beta_0 + \beta_1 x)}}$~~

Quiz #4

Feb. 10, 2017

20 pts

12/20

#1. Which of the following is the same expression as $y = \frac{e^{\beta_0 + \beta_1 x}}{1 + e^{\beta_0 + \beta_1 x}}$?

(3)

(a) $y = \frac{1}{1 + e^{\beta_0 + \beta_1 x}}$

(b) $y = \frac{1}{1 + e^{-(\beta_0 + \beta_1 x)}}$

(c) $y = \frac{1}{e^{\beta_0 + \beta_1 x}}$

#2. In $y = \frac{1}{1 + e^{-x}}$, what's the value of y when $x = 0$?

(3)

#3. In $y = \frac{1}{1 + e^{-x}}$, what's the value of y when $x = \infty$?

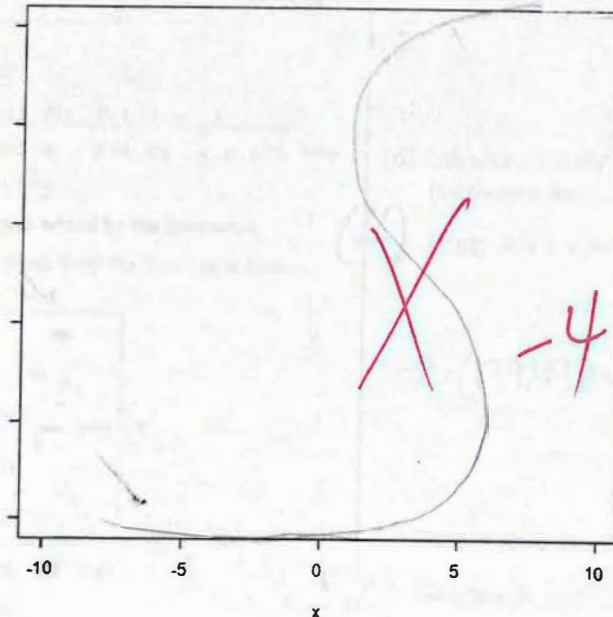
(3)

#4. In $y = \frac{1}{1 + e^{-x}}$, what's the value of y when $x = -\infty$ (i.e., minus infinity)?

(3)

#5. Putting #2, #3, & #4 together, roughly "sketch" the graph of $y = \frac{1}{1 + e^{-x}}$.

(4)



Quiz #4 (Keys)

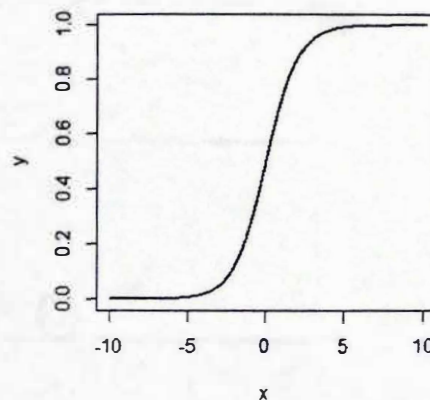
#1 (b) Divide both top and bottom by $e^{\beta_0 + \beta_1 x}$

#2 $\frac{1}{2}$ Because $e^0 = 1$

#3 1 Because $e^{-\infty} = 0$

#4 0 Because $e^{\infty} = \infty$

#5



#6 $p = \frac{1}{1 + e^{-(\beta_0 + \beta_1 x)}}$

#6. Consider $\log\left(\frac{p}{1-p}\right) = \beta_0 + \beta_1 x$. Rewrite this expression in terms of p .

(4)

$\frac{p}{1-p} = e^{\beta_0 + \beta_1 x}$
 \log

X

$\hat{p} = \frac{1}{1 + e^{-(\beta_0 + \beta_1 x)}}$

Quiz #5

Feb. 17, 2017

20

pts

Consider the following R codes and printout.

```
> library(faraway)
> data(bliss)
> bliss
  dead alive conc
1    2    28    0
2    8    22    1
3   15    15    2
4   23     7    3
5   27     3    4
> attach(bliss)
> Y <- cbind(dead, alive)
> modell <- glm(Y~conc, family=binomial(link=logit))
> summary(modell)
```

Coefficients:

	Estimate	Std. Error	z value	Pr(> z)
(Intercept)	-2.3238	0.4179	-5.561	2.69e-08
conc	1.1619	0.1814	6.405	1.51e-10

Dispersion parameter for binomial family taken to be 1
Null deviance: 64.76327 on 4 degrees of freedom
Residual deviance: 0.37875 on 3 degrees of freedom
AIC: 20.854

```
> p1 = (dead/(dead+alive))
> p2 = predict(modell, type="response")
> r1 = p1-p2
> round(cbind(p1,p2,r1), 4)
      p1      p2      r1
1 0.0667 0.0892 -0.0225
2 0.2667 0.2383  0.0283
3 0.5000 0.5000  0.0000
4 0.7667 0.7617  0.0050
5 0.9000 0.9108 -0.0108
```

#1. Look at the p -value for "conc", i.e., $1.51e-10$. Explain briefly what this p -value means in plain terms. No points if you just write "reject H_0 " or "do not reject H_0 ".

(3) The p -value of $1.51e-10$ for conc. means that the parameter 'conc.' significantly predicts 'y' & should therefore be kept in the model.

#2. Explain what this calculation $e^{1.1619} = 3.196$ tells you. Oh, 1.1619 is the coefficient of "conc" in the printout.

(4) It tells you the odds ratio ~~been what?~~ ~~factor?~~ -2
See Ans. key

as conc. ↑ by 1 unit, odds for dead become 3.196 x higher

#3. According to the printout, how would you estimate the "odds" for "dead" at conc=1? Just write the set up, you do NOT need to finish calculation.

(4)

R code

$\exp(-2.3238 + 1.1619)$ ✓

#4. According to the printout, how would you estimate the "probability" for "dead" at conc=1? Just write the set up, you do NOT need to finish calculation.

(3)

$1/(1 + \exp(-2.3238 + 1.1619))$ ✓

#5. What do the two "deviance" numbers (i.e., 64.76327 & 0.37875) tell you? Explain briefly where/how these two numbers are used.

(3)

These #'s are used to compare the deviance between the null model & the actual obs. deviance
null dev. - resid dev. (OK)

#6. Shown under p1, p2 and r1 are "actual" probability, "predicted" probability and "residual", respectively. Which of the following is the most ideal case for the "residuals"?

- (a) mostly positive residuals
- (b) mostly negative residuals
- (c) random mixture of positive and negative residuals ✓
- (d) residuals that change signs constantly, i.e., +, -, +, -, +, -, etc

Quiz #5 (Keys)

#1 "conc" is highly significant, i.e., it's a very significant variable in modeling the probability of "dead".

#2 It's the odds ratio for 1 unit increase of conc, i.e., as conc increases by 1 unit, odds for dead become 3.196 times bigger.

#3 $e^{-2.3238 + (1.1619 \times 1)} = 0.3128911$

#4 $\frac{1}{1 + e^{-\{-2.3238 + (1.1619 \times 1)\}}} = 0.238322$

#5 They are used to test if the model is valid, i.e., $(64.76327 - 0.37875) \sim \chi^2_{df=1}$

#6 c

#3. According to the printout, how "odds" for "dead" at conc=1? do NOT need to finish calculate

R code

$$\exp(-2.3238 + 1.1619)$$

#4. According to the printout, how "probability" for "dead" at conc=1? up, you do NOT need to finish calculate

$$1 / (1 + \exp(-2.3238))$$

#5. What do the two "deviance" numbers (0.37875) tell you? Explain briefly what the numbers are used.

These #'s are the deviance between the model & the actual null dev. - resid dev

#6. Shown under p1, p2 and r1 are "predicted" probability and "residuals". Which of the following is the most likely?

- (a) mostly positive residuals
- (b) mostly negative residuals

logit))

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-08
-10

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Explain
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-2

Quiz #6

Feb. 24, 2017

20 pts

Let X be the number of "failures" before the r th "success" in binomial trials. We say X has a negative binomial distribution with (r, p) parameters. The pdf of X is given by

$$f(x) = \binom{x+r-1}{r-1} p^r (1-p)^x, \text{ where } x = 0, 1, 2, 3, \dots$$

The mean & variance of X are $\mu = \frac{r(1-p)}{p}$, $\sigma^2 = \frac{r(1-p)}{p^2}$.

#1. Let $X \sim$ negative binomial ($r=3, p=0.5$). Find the probability that $X=1$. Set up is enough, you do NOT need to finish calculation.

(4)

$$P(X=1) = \binom{1+3-1}{3-1} (1/2)^3 (1/2)^1 = \frac{3}{4}$$

#2. Let $X \sim$ negative binomial ($r=3, p=0.5$). Find the mean and the variance of X . Finish calculation!

(4)

$$\mu = \frac{3(1-0.5)}{0.5} = 3$$

$$\sigma^2 = \frac{3(1-0.5)}{0.5^2} = 6$$

#3. Let $X \sim$ negative binomial ($r=3, p=0.5$). The R command for the negative binomial distribution is `nbinom`. Write R codes to compute the probability that $X=1$.

(3)

$$\text{nbinom}(1, \text{size}=3, \text{prob}=1/2)$$

#4. Let $X \sim$ negative binomial ($r=3, p=0.5$). Write R codes to simulate 1,000 random numbers from a negative binomial distribution with ($r=3, p=0.5$).

(3)

$$\text{rnbinom}(1000, \text{size}=3, \text{prob}=1/2)$$

#5. Suppose we have a dataset with "survival" time for men and women. The three variables used are:

(3)

- `time` = time until death
- `status` = alive(1), dead(2)
- `sex` = male(1), female(2)

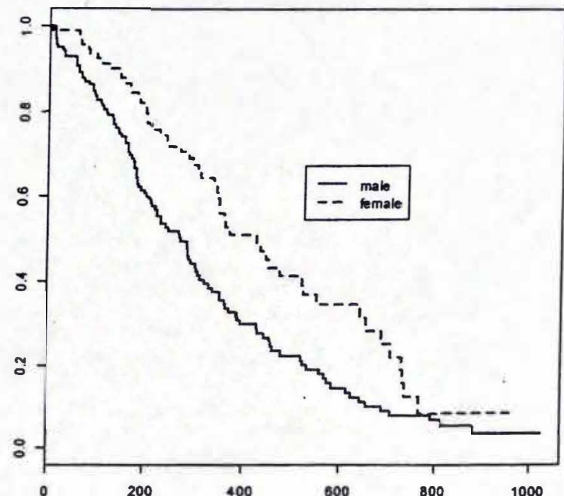
Which of the following are the commonly used distributions for "time"? Just circle all the popular distribution name(s) that can handle such a variable as "time" here.

- (a) lognormal distribution
- (b) exponential distribution ✓
- (c) Poisson distribution
- (d) Weibull distribution

#6. (Continued from #5.)

R codes and plot:

```
> surv_time <- Surv(time, status==2)
> modell <- survfit(surv_time~sex)
> plot(modell, col=c(2,4), lwd=2, lty=1:2)
> legend(locator(1), c("male", "female"), lwd=2, col=c(2,4), lty=1:2)
```



According to the plot, whose median survival time is greater: male or female? Just circle your answer -- answer alone is enough.

(3)

Quiz #6 (Keys)

$$\#1 \quad f(1) = \binom{1+3-1}{3-1} 0.5^3 (1-0.5)^1 = \binom{3}{2} 0.5^4 = \frac{3}{16} = 0.1875$$

#2 mean=3; var=6

#3 > drbinom(1, 3, 0.5)

#4 > rnbinom(1000, 3, 0.5)

#5 a, b, d

#6 female

ave a dataset with
The three variables
ne until death
alive(1), dead (2)
le (1), female (2)
following are the c
for "time"? Just cin
name(s) that can h

mal distribution
ential distribution
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all distribution

rom #5.)

lot:

```
<- Surv(time, stat)
survfit(surv_time,
1, col=c(2,4), lwd=
ator(1), c("male",
, lty=1:2)
```