

# Problem Set 3

Munan Hou

November 8, 2016

```
> library(dplyr)
```

## 1

```
> hipp <- read.csv("C:/YUKIHO/BU/MA 615/Classes/9.12.2016/class 9.12.2016/ma_568/Homework
> plot(hipp$xN,hipp$yN,type='l',col='blue', xlab="X", ylab="Y")
> hipp1 <- subset(hipp,spikes==1)
> hipp2 <- subset(hipp,spikes2==1)
> points(hipp1$xN,hipp1$yN,col='red',pch=19)
> points(hipp2$xN,hipp2$yN,col='green',pch=19)
```

## 2

```
> model1 <- glm(spikes~xN+yN,family = poisson,data=hipp)
> summary(model1)
```

Call:

```
glm(formula = spikes ~ xN + yN, family = poisson, data = hipp)
```

Deviance Residuals:

Min	1Q	Median	3Q	Max
-0.5501	-0.3718	-0.2621	-0.1928	2.6004

Coefficients:

	Estimate	Std. Error	z value	Pr(> z )
(Intercept)	-3.24918	0.02760	-117.74	<2e-16 ***
xN	-0.50623	0.04724	-10.72	<2e-16 ***
yN	-1.18010	0.04477	-26.36	<2e-16 ***

---

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

(Dispersion parameter for poisson family taken to be 1)

Null deviance: 12311 on 41327 degrees of freedom  
Residual deviance: 11388 on 41325 degrees of freedom  
AIC: 15492

Number of Fisher Scoring iterations: 6

```

> lambda <- function(x,y) {
+   exp(model1$coefficients[1]+model1$coefficients[2]*x+model1$coefficients[3]*y)
+ }
> x_new <- seq(-1,1,.1)
> y_new <- seq(-1,1,.1)
> z<- outer(x_new,y_new,lambda)
> persp(x_new, y_new, z, theta = 30, phi = 30, expand = 0.5, col = "lightblue", xlab="X",
> phi <- seq(0, 2*pi, len = 201)
> xr <- cos(phi)
> yr <- sin(phi)
> lines(trans3d(xr,yr,lambda(xr,yr),res), col = "pink", lwd = 2)

```

### 3

```

> hipp$xN2 <- (hipp$xN)^2
> hipp$yN2 <- (hipp$yN)^2
> model2 <- glm(spikes~xN2+yN2+xN+yN,family = poisson,data=hipp)
> summary(model2)

```

Call:

```

glm(formula = spikes ~ xN2 + yN2 + xN + yN, family = poisson,
    data = hipp)

```

Deviance Residuals:

Min	1Q	Median	3Q	Max
-0.7260	-0.3359	-0.1564	-0.0580	3.5332

Coefficients:

	Estimate	Std. Error	z value	Pr(> z )
(Intercept)	-1.82026	0.03723	-48.89	<2e-16 ***
xN2	-5.81075	0.19772	-29.39	<2e-16 ***
yN2	-3.66241	0.13449	-27.23	<2e-16 ***
xN	-1.45219	0.09165	-15.85	<2e-16 ***
yN	-2.40928	0.09536	-25.27	<2e-16 ***

---

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

(Dispersion parameter for poisson family taken to be 1)

Null deviance: 12311.2 on 41327 degrees of freedom  
Residual deviance: 9141.5 on 41323 degrees of freedom  
AIC: 13249

Number of Fisher Scoring iterations: 7

```

> lambda2 <- function(x,y) {
+   exp(model2$coefficients[1]+model2$coefficients[2]*(x^2)+model2$coefficients[3]*(y^2)+
+   }
> z2<- outer(x_new,y_new,lambda2)
> persp(x_new, y_new, z2, theta = 30, phi = 30, expand = 0.5, col = "lightblue", xlab="X",

```

```

> phi <- seq(0, 2*pi, len = 201)
> xr <- cos(phi)
> yr <- sin(phi)
> lines(trans3d(xr,yr,lambda(xr,yr),res), col = "pink", lwd = 2)

> model2$aic

[1] 13249.46

> model1$aic

[1] 15492.16

```

#### 4

```

> hipp_none <- select(hipp,spikes,xN,yN,xN2:yN2,spikes_hist1:spikes_hist20)
> p <- c()
> AIC <- c()
> for (i in 5:25) {
+   hipp_haha <- hipp_none[,1:i]
+   aa <- glm(spikes~.,family = poisson,data = hipp_haha)
+   AIC <- c(AIC,aa$aic)
+   p <- c(p,i-5)
+ }
> record <- data.frame("p"=p,"AIC"=AIC)
> plot(record$p,record$AIC,type="l",xlab="p",ylab="AIC")
> points(record$p,record$AIC)

> subset(record, AIC==min(AIC))

   p      AIC
9 8 12222.27

```

#### 5

```

> hipp_none2 <- select(hipp,spikes,xN,yN,xN2,yN2,spikes_hist1:spikes_hist8, spikes2_hist1:
> p2 <- c()
> AIC2 <- c()
> for (i in 13:33) {
+   hipp_haha <- hipp_none2[,1:i]
+   aa <- glm(spikes~.,family = poisson,data = hipp_haha)
+   AIC2 <- c(AIC2,aa$aic)
+   p2 <- c(p2,i-13)
+ }
> record2 <- data.frame("p1"=8,"p2"=p2,"AIC2"=AIC2)
> subset(record2, AIC2==min(AIC2))

  p1 p2      AIC2
1  8  0 12222.27

>

```

## 6

```
> hipp_none3 <- select(hipp,spikes,xN,yN,xN2,yN2,spikes_hist1:spikes_hist20, spikes2_hist1
> p41 <- c()
> p42 <- c()
> AIC4 <- c()
> for (k in 5:25){
+   hipp_haha <- hipp_none3[,1:k] %>% select(-xN,-yN,-xN2,-yN2)
+   aa <- glm(spikes~.,family = poisson,data = hipp_haha)
+   AIC4 <- c(AIC4,aa$aic)
+   p41 <- c(p41,k-5)
+   p42 <- c(p42,0)
+   for (i in 26:45){
+     hipp_haha <- hipp_none3[,c(1:k,26:i)] %>% select(-xN,-yN,-xN2,-yN2)
+     aa <- glm(spikes~.,family = poisson,data = hipp_haha)
+     AIC4 <- c(AIC4,aa$aic)
+     p41 <- c(p41,k-5)
+     p42 <- c(p42,i-25)
+   }
+ }
> record4 <- data.frame("p1"=p41,"p2"=p42,"AIC"=AIC4)
> subset(record4,AIC==min(AIC))
```

```
      p1 p2      AIC
441 20 20 13534.88
```

```
> hipp_none4 <- hipp_none3 %>% select(-xN,-yN,-xN2,-yN2)
> summary(glm(spikes~.,family = poisson,data=hipp_none4))
```

Call:

```
glm(formula = spikes ~ ., family = poisson, data = hipp_none4)
```

Deviance Residuals:

Min	1Q	Median	3Q	Max
-2.0625	-0.2489	-0.1972	-0.1972	3.1930

Coefficients:

	Estimate	Std. Error	z value	Pr(> z )
(Intercept)	-3.94051	0.03742	-105.301	< 2e-16 ***
spikes_hist1	-2.55106	0.18268	-13.965	< 2e-16 ***
spikes_hist2	-1.42312	0.11547	-12.324	< 2e-16 ***
spikes_hist3	-0.45895	0.08818	-5.205	1.94e-07 ***
spikes_hist4	0.59444	0.06985	8.510	< 2e-16 ***
spikes_hist5	1.24482	0.06522	19.087	< 2e-16 ***
spikes_hist6	1.25323	0.06858	18.274	< 2e-16 ***
spikes_hist7	1.00806	0.07442	13.546	< 2e-16 ***
spikes_hist8	0.63389	0.07856	8.068	7.12e-16 ***
spikes_hist9	0.39560	0.07784	5.082	3.73e-07 ***
spikes_hist10	0.33893	0.07565	4.480	7.45e-06 ***
spikes_hist11	0.28919	0.07621	3.795	0.000148 ***
spikes_hist12	0.31453	0.07596	4.141	3.46e-05 ***

spikes_hist13	0.39616	0.07504	5.280	1.30e-07	***
spikes_hist14	0.31213	0.07841	3.981	6.87e-05	***
spikes_hist15	0.38548	0.07560	5.099	3.42e-07	***
spikes_hist16	0.28811	0.07638	3.772	0.000162	***
spikes_hist17	0.32802	0.07433	4.413	1.02e-05	***
spikes_hist18	0.24784	0.07586	3.267	0.001087	**
spikes_hist19	0.20233	0.07453	2.715	0.006635	**
spikes_hist20	0.16042	0.07262	2.209	0.027186	*
spikes2_hist1	0.22766	0.07776	2.928	0.003417	**
spikes2_hist2	0.24561	0.08016	3.064	0.002184	**
spikes2_hist3	0.39466	0.07968	4.953	7.31e-07	***
spikes2_hist4	0.46794	0.07878	5.940	2.85e-09	***
spikes2_hist5	0.41320	0.08068	5.121	3.03e-07	***
spikes2_hist6	0.36760	0.08117	4.529	5.93e-06	***
spikes2_hist7	0.27017	0.08237	3.280	0.001038	**
spikes2_hist8	0.32439	0.07973	4.069	4.73e-05	***
spikes2_hist9	0.22958	0.08322	2.759	0.005800	**
spikes2_hist10	0.19785	0.08286	2.388	0.016949	*
spikes2_hist11	0.17897	0.08314	2.153	0.031344	*
spikes2_hist12	0.24048	0.08084	2.975	0.002931	**
spikes2_hist13	0.25011	0.08106	3.086	0.002031	**
spikes2_hist14	0.14923	0.08450	1.766	0.077414	.
spikes2_hist15	0.13958	0.08404	1.661	0.096743	.
spikes2_hist16	0.21924	0.08027	2.731	0.006308	**
spikes2_hist17	0.17816	0.08212	2.170	0.030035	*
spikes2_hist18	0.28880	0.07794	3.706	0.000211	***
spikes2_hist19	0.08885	0.08510	1.044	0.296475	
spikes2_hist20	0.22993	0.07722	2.978	0.002904	**

---

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

(Dispersion parameter for poisson family taken to be 1)

Null deviance: 12311.2 on 41327 degrees of freedom  
 Residual deviance: 9354.9 on 41287 degrees of freedom  
 AIC: 13535

Number of Fisher Scoring iterations: 6

## 7

```
> finalmodel <- glm(spikes~xN2+yN2+xN+yN+spikes_hist1+spikes_hist2+spikes_hist3+spikes_hist4+spikes_hist5+spikes_hist6+spikes_hist7+spikes_hist8+spikes_hist9+spikes_hist10+spikes_hist11+spikes_hist12+spikes_hist13+spikes_hist14+spikes_hist15+spikes_hist16+spikes_hist17+spikes_hist18+spikes_hist19+spikes_hist20, data=hipp)
> hipp[, "num"] <- 1:nrow(hipp)
> rehipp <- subset(hipp, spikes==1)
> Xi <- rehipp[, "num"]
> rescaled <- exp(finalmodel$coefficients[1]+finalmodel$coefficients[2]*hipp[, "xN2"]+finalmodel$coefficients[3]*hipp[, "yN2"]+finalmodel$coefficients[4]*hipp[, "xN"]+finalmodel$coefficients[5]*hipp[, "yN"]+finalmodel$coefficients[6]*hipp[, "spikes_hist1"]+finalmodel$coefficients[7]*hipp[, "spikes_hist2"]+finalmodel$coefficients[8]*hipp[, "spikes_hist3"]+finalmodel$coefficients[9]*hipp[, "spikes_hist4"]+finalmodel$coefficients[10]*hipp[, "spikes_hist5"]+finalmodel$coefficients[11]*hipp[, "spikes_hist6"]+finalmodel$coefficients[12]*hipp[, "spikes_hist7"]+finalmodel$coefficients[13]*hipp[, "spikes_hist8"]+finalmodel$coefficients[14]*hipp[, "spikes_hist9"]+finalmodel$coefficients[15]*hipp[, "spikes_hist10"]+finalmodel$coefficients[16]*hipp[, "spikes_hist11"]+finalmodel$coefficients[17]*hipp[, "spikes_hist12"]+finalmodel$coefficients[18]*hipp[, "spikes_hist13"]+finalmodel$coefficients[19]*hipp[, "spikes_hist14"]+finalmodel$coefficients[20]*hipp[, "spikes_hist15"]+finalmodel$coefficients[21]*hipp[, "spikes_hist16"]+finalmodel$coefficients[22]*hipp[, "spikes_hist17"]+finalmodel$coefficients[23]*hipp[, "spikes_hist18"]+finalmodel$coefficients[24]*hipp[, "spikes_hist19"]+finalmodel$coefficients[25]*hipp[, "spikes_hist20"])
> rescaled <- (c(0, rescaled)+c(rescaled, 0))/2
> rescaled <- rescaled[2:(length(rescaled)-1)]
> rescaled1 <- c()
```

```

> for (i in 1:(length(Xi)-1)) {
+   huhu <- sum(rescaled[Xi[i]:(Xi[i+1]-1)])
+   rescaled1 <- c(rescaled1,huhu)
+ }
> w <- seq(0,max(rescaled1),length.out = 1000)
> Femp <- numeric(length(w))
> Qs <- rescaled1[order(rescaled1)]
> for (i in 1:length(w)){
+   Femp[i] <- sum(Qs<=w[i])/length(Qs)
+ }
> plot(Femp,1-exp(-w),type = "l",lwd=2,ylab="Model_CDF", xlab="Empirical_CDF",main="Rescal
> abline(0,1,col="red")
> abline(1.36/sqrt(nrow(rehipp)),1,lty=2,col="red")
> abline(-1.36/sqrt(nrow(rehipp)),1,lty=2,col="red")

```