HW#1

1. data <- read.table("renal_cell_carcinoma.txt",header=T,row.names=1) dim(data)

```
[1] 22283 22
```

2.

```
GSM146778 GSM146780 GSM146782

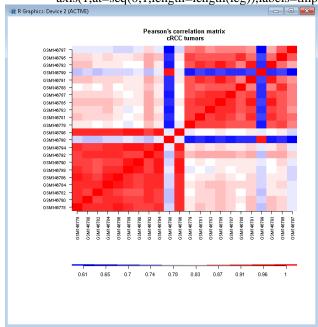
1007_s_at 1942.1 2358.3 2465.2

1053_at 40.1 58.2 132.6

117_at 72.1 248.8 85.5
```

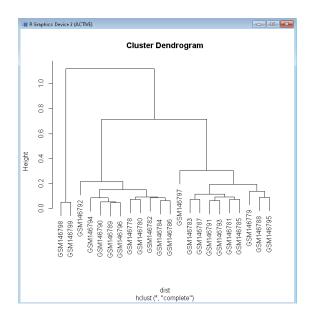
3. dat.cor <- cor(data,use="pairwise.complete.obs")
layout(matrix(c(1,1,1,1,1,1,1,1,2,2), 5, 2, byrow = TRUE))
par(oma=c(5,7,1,1))
cx <- rev(colorpanel(25,"red","white","blue"))
leg <- seq(min(dat.cor,na.rm=T),max(dat.cor,na.rm=T),length=10)
image(dat.cor,main="Pearson's correlation matrix\n cRCC tumors",axes=F,col=cx)
axis(1,at=seq(0,1,length=ncol(dat.cor)),label=dimnames(dat.cor)[[2]],cex.axis=0.9,las=2)
axis(2,at=seq(0,1,length=ncol(dat.cor)),label=dimnames(dat.cor)[[2]],cex.axis=0.9,las=2)
image(as.matrix(leg),col=cx,axes=F)

tmp <- round(leg,2)
axis(1,at=seq(0,1,length=length(leg)),labels=tmp,cex.axis=1)</pre>



```
> dist <- dist(dat.cor, diag=TRUE)
```

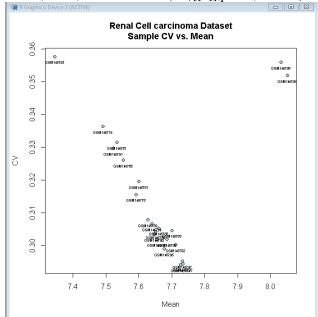
- > hc <- hclust(dist)
- > plot(hc)



- > dat <- as.data.frame(data)
- > dat.mean <- apply(log2(dat),2,mean)
- > dat.sd <- sqrt(apply(log2(dat),2,var))
- > dat.cv <- dat.sd/dat.mean
- > plot(dat.mean,dat.cv,main="Renal Cell carcinoma Dataset\nSample CV vs.

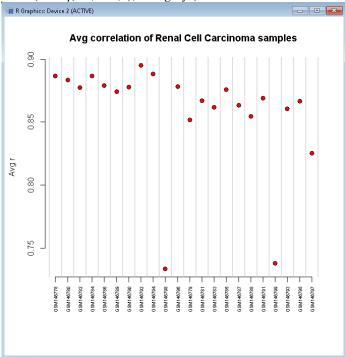
Mean",xlab="Mean",ylab="CV",col='blue',cex=1.5,type="n")

- > points(dat.mean,dat.cv,bg="lightblue",col=1,pch=21)
- > text(dat.mean,dat.cv,label=dimnames(dat)[[2]],pos=1,cex=0.5)



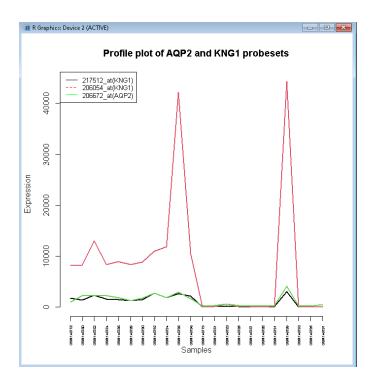
```
dat.avg <- apply(dat.cor,1,mean)
par(oma=c(3,0.1,0.1,0.1))
plot(c(1,length(dat.avg)),range(dat.avg),type="n",xlab="",ylab="Avg r",main="Avg correlation of Renal Cell Carcinoma samples",axes=F)
points(dat.avg,bg="red",col=1,pch=21,cex=1.25)
axis(1,at=c(1:length(dat.avg)),labels=dimnames(dat)[[2]],las=2,cex.lab=0.4,cex.axis=0.6)
```

axis(2) abline(v=seq(0.5,62.5,1),col="grey")



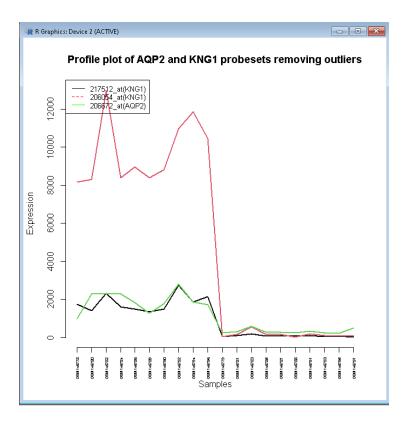
From looking through all of the data sets that are identified in these graphs the outliers are GSM146798 and GSM146799.

```
6. library(impute)
7. drop <- c("GSM146798","GSM146799")
df = dat[,!(names(dat) %in% drop)]
8.Plotted both data sets with outliers present and outliers removed was unsure which one was wanted.
probesets for KNG1 = 217512_at, and 206054_at
AQP2 = 206672_at
probesets <- dat[c("206054_at","217512_at","206672_at"),]
plot(c(1,ncol(probesets)),range(probesets[,]),type='n',main="Profile plot of AQP2 and KNG1
probesets",xlab="Samples",ylab="Expression",axes=F)
axis(side=1,at=c(1:22),labels=dimnames(probesets)[[2]],cex.axis=0.4,las=2)
axis(side=2)
for(i in 1:length(dimnames(probesets)[[1]])){
dat.y <- as.numeric(probesets[p[i],])
lines(c(1:ncol(probesets)),dat.y,col=i,lwd=2)
legend("topleft", legend = c("217512_at(KNG1)", "206054_at(KNG1)", "206672_at(AQP2)"),
col=c("black", "red", "green"), lty=1:2, cex=0.8)
```



The data from this plot does not seem to indicate normal renal function for the probeset of 206054 which is depicted as red line from the legend we are seeing huge spikes in expression in comparison to the two other probesets.

```
\label{eq:policy} $\operatorname{plot}(c(1,\operatorname{ncol}(\operatorname{probesets2})),\operatorname{range}(\operatorname{probesets2}[,]),\operatorname{type='n',main="Profile}\ \operatorname{plot}\ \operatorname{of}\ \operatorname{AQP2}\ \operatorname{and}\ \operatorname{KNG1}\ \operatorname{probesets}\ \operatorname{removing}\ \operatorname{outliers''},\operatorname{xlab="Samples''},\operatorname{ylab="Expression''},\operatorname{axes=F})\ \operatorname{axis}(\operatorname{side=1},\operatorname{at=c}(1:20),\operatorname{labels=dimnames}(\operatorname{probesets})[[2]],\operatorname{cex.axis=0.4},\operatorname{las=2})\ \operatorname{axis}(\operatorname{side=2})\ \operatorname{for}(i\ \operatorname{in}\ 1:\operatorname{length}(\operatorname{dimnames}(\operatorname{probesets2})[[1]]))\{\ \operatorname{dat.y}<-\ \operatorname{as.numeric}(\operatorname{probesets2})[[1]])\}\ \operatorname{dat.y}<-\ \operatorname{as.numeric}(\operatorname{probesets2})[[1]])\}\ \operatorname{lines}(c(1:\operatorname{ncol}(\operatorname{probesets2})),\operatorname{dat.y},\operatorname{col=i},\operatorname{lwd=2})\ \}\ \operatorname{legend}("\operatorname{topleft''},\operatorname{legend}=c("217512\_\operatorname{at}(\operatorname{KNG1})","206054\_\operatorname{at}(\operatorname{KNG1})","206672\_\operatorname{at}(\operatorname{AQP2})"),\ \operatorname{col=c}("\operatorname{black''},"\operatorname{red''},"\operatorname{green''}),\operatorname{lty=1:2},\operatorname{cex=0.8})
```



```
9. repalced2<- replace(data,data==8385.3,NA) datam<- data.matrix(repalced2) Without outliers: repalced3<- replace(df,df==8385.3,NA) dataf<- data.matrix(repalced3)
```

10.

new<-impute.knn(datam, k = 6) showing the value produced: imputematrix <- as.matrix(new) imputeddata <- data.frame(imputematrix[1,]) imputeddata["206054_at","data.GSM146784"]

11.

With out outliers removed:

8385.3

7632.35

Relative error = |(8385.3-7632.35)|/8385.3=0.0898=9%

Removing outliers:

8385.3

7559.533

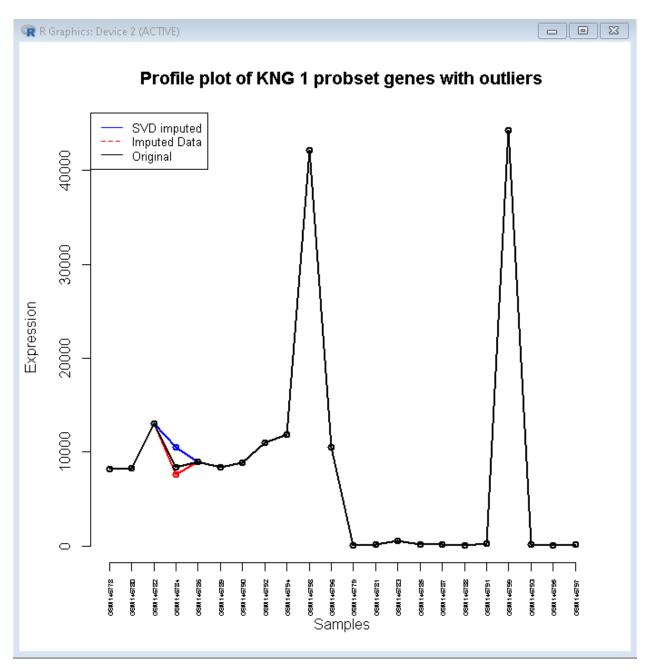
|(8385.3-7559.533)|/8385.3 = 0.0985 = 10%

12. pc<-pca(datam, nPcs = 9, method="svdImpute") imputedSVD <- completeObs(pc) imputedSVD["206054_at", "GSM146784"] value with outliers = 10541.34 For the Values without outliers: pc2<-pca(datam, nPcs = 9, method="svdImpute")

```
value produced from imputation without out liers = 10418
 colnames(imputdat) <- c("GSM146778",
"GSM146780", "GSM146782", "GSM146784", "GSM146786", "GSM146789", "GSM146790", "GSM146792",
                     "GSM146794", "GSM146798", "GSM146796", "GSM146779", "GSM146781", "GSM146783", "GSM146785", "GSM146798", "GSM146798", "GSM146798", "GSM146798", "GSM146798", "GSM146798", "GSM146798", "GSM146798", "GSM146798", "GSM146785", "GSM146798", "GSM146798", "GSM146798", "GSM146798", "GSM146788", "GSM1467888", "GSM146788", "G
                     ","GSM146787","GSM146788","GSM146791","GSM146799","GSM146793","GSM146795","GSM14679
imputedSVD2<- data.frame(imputedSVD)</pre>
SVD <- imputedSVD2["206054 at",]
Imputdat <- imputeddata["206054 at",]
rand.genes <- sample(dimnames(data)[[1]])
plot(c(1,ncol(dat)),range(imputdat[,]),type='n',main="Profile plot of KNG 1 probset genes with
outliers",xlab="Samples",ylab="Expression",axes=F)
axis(side=1,at=c(1:22),labels=dimnames(data)[[2]],cex.axis=0.4,las=2)
axis(side=2)
for(i in 1:length(rand.genes)) {
dat.n <- as.numeric(SVD[rand.genes[i],])
dat.y <- as.numeric(imputdat[rand.genes[i],])</pre>
dat.z<- as.numeric(dat[rand.genes[i],])</pre>
lines(c(1:ncol(dat)),dat.n,col="blue",lwd=2)
lines(c(1:ncol(dat)),dat.y,col="red",lwd=2)
lines(c(1:ncol(dat)),dat.z,col="black",lwd=2)
points(c(1:ncol(dat)),dat.n,col="blue",lwd=2)
points(c(1:ncol(dat)),dat.y,col="red",lwd=2)
points(c(1:ncol(dat)),dat.z,col="black",lwd=2)
legend("topleft",legend=c("SVD imputed", "Imputed Data", "Original"),col=c("blue", "red", "black"),lty=1:2,
```

imputedSVD2 <- completeObs(pc2)</pre>

cex=0.8)



```
Without the outliers:  df2 <- df["206054\_at",] \\ imputdat2 <- imputeddata2["206054\_at",] \\ imputedSVD3 <- data.frame(imputedSVD2) \\ SVD2 <- imputedSVD3["206054\_at",] \\ rand.genes2 <- sample(dimnames(df)[[1]]) \\ plot(c(1,ncol(df)),range(imputdat2[,]),type='n',main="Profile plot of KNG 1 probset genes without outliers",xlab="Samples",ylab="Expression",axes=F) \\ axis(side=1,at=c(1:20),labels=dimnames(df)[[2]],cex.axis=0.4,las=2) \\ axis(side=2) \\ for(i in 1:length(rand.genes)) \{ \\ dat.n <- as.numeric(SVD2[rand.genes2[i],]) \\ dat.y <- as.numeric(imputdat2[rand.genes2[i],]) \\ dat.z <- as.numeric(df2[rand.genes2[i],]) \\ dat.z <- as.num
```

