## Homework5

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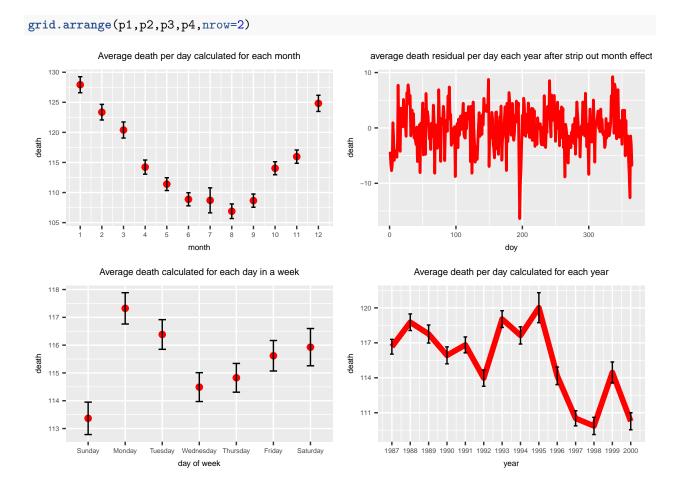
```
library("dlnm")

## This is dlnm 2.3.9. For details: help(dlnm) and vignette('dlnmOverview').

library("data.table")
data(chicagoNMMAPS)
dat<-data.table(chicagoNMMAPS)
library("ggplot2")
library("gridExtra")</pre>
```

#### there are strong evidence of trend and seasonality in the death

```
month.death<-dat[,.(death=mean(death),sd=sd(death)/sqrt(.N)),by=c("month")]</pre>
p1<-ggplot(data=month.death,aes(x=month,y=death))+geom_point(color="red",size=2)+
  geom_errorbar(aes(ymin=death-sd*1.96,ymax=death+sd*1.96,width=0.2))+
  scale x continuous(breaks=c(1:12),labels=paste(1:12))+
  ggtitle("Average death per day calculated for each month")+
  theme(plot.title=element_text(hjust=0.5),text=element_text(size=6))
dat$month<-as.factor(dat$month)</pre>
detrend<-lm(death~month,data=dat)</pre>
dat$preddeath<-predict(detrend,dat)</pre>
dat$residual<-dat$preddeath-dat$death
day.death<-dat[,.(death=mean(residual),sd=sd(residual)/sqrt(.N)),by=c("doy")]</pre>
p2<-ggplot(data=day.death,aes(x=doy,y=death))+geom_line(color="red",size=1)+
  ggtitle("average death residual per day each year after strip out month effect")+
  theme(plot.title=element_text(hjust=0.5),text=element_text(size=6))
week.death<-dat[,.(death=mean(death),sd=sd(death)/sqrt(.N)),by=c("dow")]</pre>
p3<-ggplot(data=week.death,aes(x=dow,y=death))+geom_point(color="red",size=2)+
  geom errorbar(aes(ymin=death-sd,ymax=death+sd,width=0.2))+
  ggtitle("Average death calculated for each day in a week")+
  theme(plot.title=element_text(hjust=0.5),text=element_text(size=6))+xlab("day of week")
year.death<-dat[,.(death=mean(death),sd=sd(death)/sqrt(.N)),by=c("year")]</pre>
p4<-ggplot(data=year.death,aes(x=year,y=death))+geom_line(color="red",size=2)+
  geom_errorbar(aes(ymin=death-sd,ymax=death+sd,width=0.2))+
  scale_x_continuous(breaks=c(1987:2000),labels=paste(1987:2000))+
  ggtitle("Average death per day calculated for each year")+
  theme(plot.title=element_text(hjust=0.5),text=element_text(size=6))
```



## too hot or too cold cause people to die, as expexted

```
dat<-data.table(chicagoNMMAPS)
# C to F
dat$temp<-dat$temp*9/5+32
dat$temp60<-ifelse(dat$temp > 60, dat$temp-60, 0)
dat$temp75<-ifelse(dat$temp > 75, dat$temp-75, 0)

lm_fit<-lm(death-temp+temp60+temp75,data=dat)
predicted_death <- data.table(death_pred = predict(lm_fit, dat), temp=dat$temp)

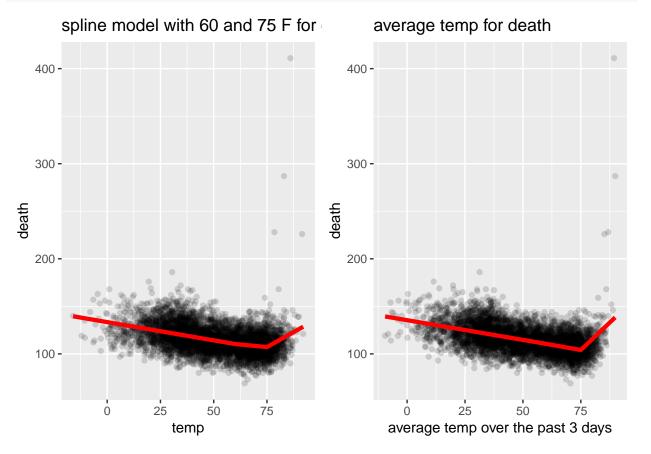
p1<-ggplot(data=dat,aes(x=temp,y=death))+geom_point(alpha=0.15)+
    geom_line(color="red",size=1.5,data=predicted_death,aes(x=temp,y=death_pred))+
    ggtitle("spline model with 60 and 75 F for death")

store<-shift(dat$temp,1:3,fill=0,type=c("lag"))
dat$modified.temp<-(store[[1]]+store[[2]]+store[[3]])/3
    rm(store)
dat$modified.temp60<-ifelse(dat$modified.temp > 60, dat$modified.temp-60, 0)
dat$modified.temp75<-ifelse(dat$modified.temp > 75, dat$modified.temp-75, 0)
```

```
lm_fit<-lm(death~modified.temp+modified.temp60+modified.temp75,data=dat)
predicted_death <- data.table(death_pred = predict(lm_fit, dat), modified.temp=dat$modified.temp)

p2<-ggplot(data=dat,aes(x=modified.temp,y=death))+geom_point(alpha=0.15)+
    geom_line(color="red",size=1.5,data=predicted_death,aes(x=modified.temp,y=death_pred))+
    ggtitle("average temp for death")+xlab("average temp over the past 3 days")

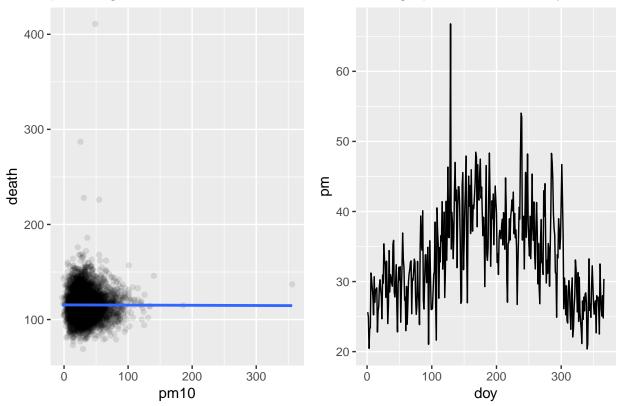
grid.arrange(p1,p2,nrow=1)</pre>
```



## it seems pm10 do not have much impact on death rate

#### pm10 against death

#### average pm10 for each doy



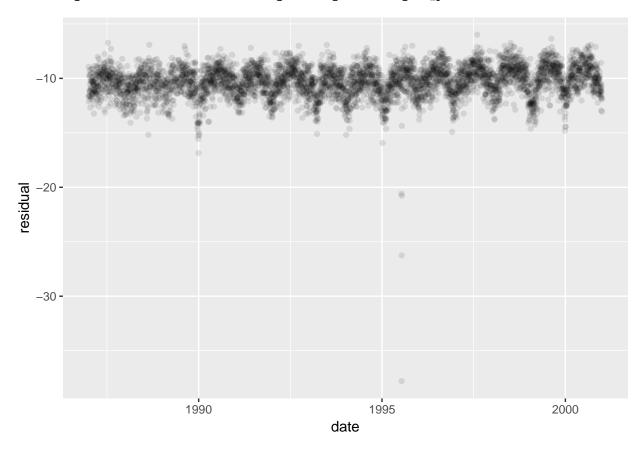
```
dat<-data.table(chicagoNMMAPS)</pre>
dat$cummonth<-((dat$year-1987)*12+dat$month-1)</pre>
dat$cumyear<-dat$year-1987</pre>
dat$cumday<-dat$date-dat$date[1]</pre>
dat$cumseason<-dat$cumyear*4+floor((dat$month-0.01)/3)</pre>
# already created
dat<-data.table(chicagoNMMAPS)</pre>
# C to F
dat$temp<-dat$temp*9/5+32
dat$temp60<-ifelse(dat$temp > 60, dat$temp-60, 0)
dat$temp75<-ifelse(dat$temp > 75, dat$temp-75, 0)
store<-shift(dat$temp,1:3,fill=0,type=c("lag"))</pre>
dat$modified.temp<-(store[[1]]+store[[2]]+store[[3]])/3</pre>
rm(store)
dat$modified.temp60<-ifelse(dat$modified.temp > 60, dat$modified.temp-60, 0)
dat$modified.temp75<-ifelse(dat$modified.temp > 75, dat$modified.temp-75, 0)
dat$year<-as.factor(dat$year)</pre>
fit<-glm(death~pm10+year+temp+temp60+temp75+modified.temp+modified.temp60+modified.temp75,data=dat,fami
summary(fit)
```

```
## Call:
## glm(formula = death ~ pm10 + year + temp + temp60 + temp75 +
      modified.temp + modified.temp60 + modified.temp75, family = poisson,
##
      data = dat)
## Deviance Residuals:
                    Median
      Min
                10
                                  30
                                          Max
## -3.7169 -0.7996 -0.0493 0.6998 18.1368
##
## Coefficients:
                    Estimate Std. Error z value Pr(>|z|)
## (Intercept)
                   4.918e+00 7.365e-03 667.831 < 2e-16 ***
## pm10
                   3.087e-04 8.085e-05 3.818 0.000135 ***
## year1988
                   3.302e-03 7.409e-03 0.446 0.655786
## year1989
                   8.965e-03 7.479e-03 1.199 0.230648
## year1990
                  -6.843e-04 7.176e-03 -0.095 0.924027
                   3.958e-03 7.219e-03 0.548 0.583455
## year1991
## year1992
                  -2.318e-02 7.184e-03 -3.226 0.001255 **
                   1.771e-02 7.093e-03 2.497 0.012536 *
## year1993
                   7.415e-03 7.115e-03
## year1994
                                        1.042 0.297321
## year1995
                   1.672e-02 7.053e-03 2.371 0.017723 *
## year1996
                  -2.742e-02 7.138e-03 -3.841 0.000122 ***
                  -5.734e-02 7.193e-03 -7.972 1.56e-15 ***
## year1997
                  -4.562e-02 7.210e-03 -6.327 2.50e-10 ***
## year1998
## year1999
                  -1.980e-02 7.127e-03 -2.778 0.005470 **
## year2000
                  -5.126e-02 7.231e-03 -7.089 1.36e-12 ***
                   1.706e-04 2.107e-04 0.810 0.418174
## temp
                   2.342e-03 5.704e-04
## temp60
                                         4.106 4.03e-05 ***
                   1.334e-03 1.322e-03
                                        1.009 0.312773
## temp75
## modified.temp
                  -3.700e-03 2.144e-04 -17.256 < 2e-16 ***
## modified.temp60 -2.805e-03 5.713e-04 -4.909 9.16e-07 ***
## modified.temp75 2.377e-02 1.504e-03 15.799 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## (Dispersion parameter for poisson family taken to be 1)
##
##
      Null deviance: 9383.4 on 4862 degrees of freedom
## Residual deviance: 6677.6 on 4842 degrees of freedom
     (251 observations deleted due to missingness)
## AIC: 38714
## Number of Fisher Scoring iterations: 4
# AIC 40721
# deviance 9873.8
dat<-data.table(chicagoNMMAPS)</pre>
dat$season<-floor((dat$month-0.01)/3)+1
\# C to F
dat$temp<-dat$temp*9/5+32
dat$temp60<-ifelse(dat$temp > 60, dat$temp-60, 0)
dat$temp75<-ifelse(dat$temp > 75, dat$temp-75, 0)
```

```
store<-shift(dat$temp,1:3,fill=0,type=c("lag"))</pre>
dat$modified.temp<-(store[[1]]+store[[2]]+store[[3]])/3</pre>
rm(store)
dat$modified.temp60<-ifelse(dat$modified.temp > 60, dat$modified.temp-60, 0)
dat$modified.temp75<-ifelse(dat$modified.temp > 75, dat$modified.temp-75, 0)
fit2<-glm(death~pm10+as.factor(season)+temp+temp60+temp75+modified.temp+modified.temp60+modified.temp75
fit3<-glm(death~pm10+as.factor(month)+temp+temp60+temp75+modified.temp+modified.temp60+modified.temp75,
table <- matrix (NA, nrow=3, ncol=6)
colnames(table)<-c(" PM10 coef", " Standard error", "95% CI", "Model df", "Deviance", "AIC")</pre>
rownames(table)<-c("Year", "Season", "Month")</pre>
fit1<-glm(death~pm10+as.factor(year)+temp60+temp75+modified.temp+modified.temp60+modified.temp75,d
fit2<-glm(death~pm10+as.factor(season)+temp+temp60+temp75+modified.temp+modified.temp60+modified.temp75
fit3<-glm(death~pm10+as.factor(month)+temp+temp60+temp75+modified.temp+modified.temp60+modified.temp75,
table[1,1:2] <-summary(fit1)$coefficient[2,1:2]</pre>
table[1,4] < -summary(fit1) df[1]-1
table[1,5] <- summary(fit1) $deviance
table[1,6] <-summary(fit1) $aic
table[2,1:2] <- summary(fit2) $coefficient[2,1:2]
table[2,4] < -summary(fit2) df[1]-1
table[2,5]<-summary(fit2)$deviance
table[2,6] <- summary(fit2) $aic
table[3,1:2] <-summary(fit3)$coefficient[2,1:2]</pre>
table[3,4] < -summary(fit3) df[1]-1
table[3,5]<-summary(fit3)$deviance
table[3,6] <- summary(fit3) $aic
for( i in 1:3){
 table[i,3] <-paste(as.numeric(table[i,1])-1.96*as.numeric(table[i,2]),
                   as.numeric(table[i,1])+1.96*as.numeric(table[i,2]), collapse="-")
}
table
##
                                 Standard error
## Year "0.000308681708124519" "8.08490594950916e-05"
## Season "0.000331627057560469" "8.08380921562627e-05"
## Month "0.000316181893219149" "8.18453391078264e-05"
         95% CI
##
                                                     Model df
## Year "0.000150217551514139 0.000467145864734898" "20"
## Season "0.000173184396934194 0.000490069718186744" "10"
## Month "0.000155765028567809 0.000476598757870489" "18"
##
         Deviance
                            AIC
## Year "6677.62026461159" "38713.587324815"
## Season "6941.17393376242" "38957.1409939658"
## Month "6835.44293623116" "38867.4099964346"
```

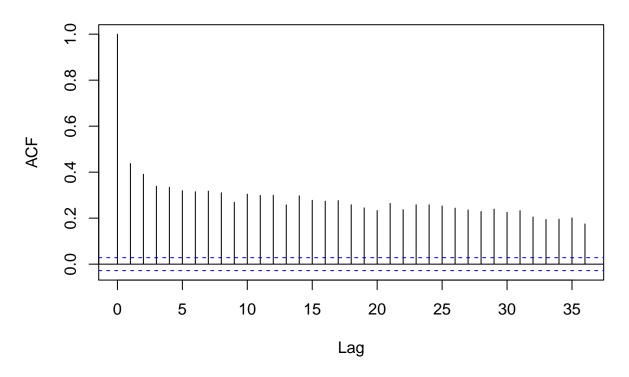
```
# pearson residual
dat$pred<-predict(fit3,dat)
dat$residual<-(dat$pred-dat$death)/sqrt(mean(dat$death))
ggplot(data=dat,aes(x=date,y=residual))+geom_point(alpha=0.1)</pre>
```

## Warning: Removed 251 rows containing missing values (geom\_point).



acf(na.omit(dat\$residual))

# Series na.omit(dat\$residual)

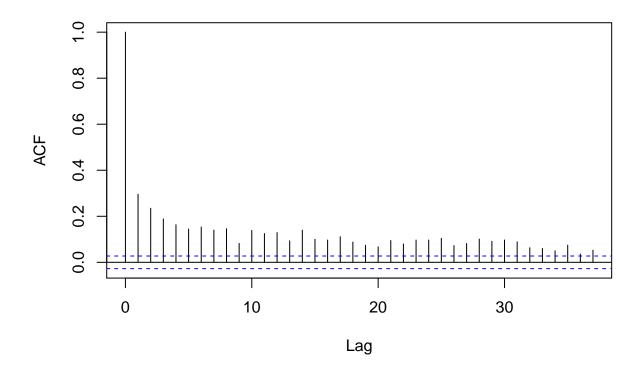


```
dat<-data.table(chicagoNMMAPS)

dat$month<-as.factor(dat$month)
detrend<-lm(death~month,data=dat)
dat$preddeath<-predict(detrend,dat)
dat$residual<-dat$preddeath-dat$death

# the trend still lasts if use month model
acf(dat$residual)</pre>
```

## Series dat\$residual



6 We have great finding! pm10 do affect motarility of human being at 99% significance level in our model. The positive coeficient with month, season, year model are all significent, suggest a larger pm10 level lead to more death per day. So action is needed.