## **Econometrics Term Project**

To statistically examine the impact of various crimes on the GSDP(Gross state Domestic Product) growth rate taking into account various crimes between 2001-11

Submitted By:

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## **Objective**

India is a Union of States and is governed by a written Constitution which was adopted by the Constituent Assembly on 26 November 1949 and came into force on 26 January 19501. It consists of 28 States and 8 union Territories. Due to its colonial heritage, India follows the Anglo-Saxon common law system. Article 14 of the Constitution provides for equality before the law. Article 21 guarantees protection of life and personal liberty. Article 20 provides protection against double jeopardy Article 39-A mandates the State to secure equal justice for all. Article 50 provides for separation of the judiciary from the executive in the public services of the State.

Our Objective is to statistically examine the impact of various crimes on the GSDP(Gross state Domestic Product) growth rate taking into account various crimes between 2001-11.

## **Data Sources:**

We have collected the crimes recorded in individual states from 2001 to 2011 from Ministry of Home Affairs reports on Crime in India, official database of Indian Government (<a href="www.data.gov.in">www.data.gov.in</a>) and other government sources like <a href="www.knowindia.gov.in">www.knowindia.gov.in</a>, various government databases, reports and website to compile the data of crimes and their segregation over the years from the below mentioned sources. We have also collected the GDP Data for individual state over the period of time from the Ministry of Statistics and Programme Implementation website (<a href="http://www.mospi.gov.in">http://www.mospi.gov.in</a>).

## **Classification of Crimes:**

The Criminal Procedure Code classifies all the crimes into two categories:

(i) Cognizable and (ii) Non-cognizable

A Cognizable offence or case is defined as the one which an officer in-charge of a police station may investigate without the order of a magistrate and effect arrest without warrant. The Police have a direct responsibility to take immediate action on the receipt of a complaint or of credible information in such crimes, visit the scene of the crime, investigate the facts, apprehend the offender and arraign him before a Court of law having jurisdiction over the matter. Cognizable crimes are broadly categorised as those falling either under the 'Indian Penal Code (IPC)' or under the 'Special and Local Laws (SLL)'. As many as 53,44,538 Cognizable crimes were reported in the country during 2001 comprising 17.69 lakh cases registered under the IPC and 35.75 lakh cases registered under the SLL. In terms of percentage, 59.23 per cent of total cases (IPC + SLL) during 2011 were reported under Special and Local Laws and rest of the cases (41.47%) under the Indian Penal Code (IPC).

Non-Cognizable crimes are defined as those which cannot be investigated by police without the order of a competent magistrate. The Police do not initiate investigation in Non-Cognizable crimes except with magisterial permission.

#### **Broad classification of crimes:**

- 1. Murder / Homicide: Murder, attempt to commit murder, Culpable homicide not amounting to murder.
- 2. Rape: Rape, Custodial Rape, Other Rapes
- 3. Kidnapping & Abduction: Kidnapping & Abduction, Kidnapping and Abduction of Women and Girls, Kidnapping and Abduction of Others.
- 4. Dacoity/Robbery/Theft: Dacoity, Preparation and assembly to commit Dacoity, Robbery, Burglary, Theft, Auto Theft, Other Theft.
- 5. Riots
- 6. Criminal Breach of Trusts
- 7. Cheating
- 8. Counterfeiting
- 9. Arson
- 10. Hurt/Grievous Hurt
- 11. Assault against women: Dowry death, Cruelty by husband or his relatives, Assault on woman with intent to outrage her modesty, Insult to the modesty of women and Importation of girls from foreign country;
- 12. Causing Death by Negligence
- 13. Other IPC crimes: Abetment of suicide, Exposure & Abandonment, Infanticide and foeticide etc.

### Type of Data:

As we are considering the crime records for 31 states and UT's over the period of 11 years, it includes both cross sectional and time series dimensions. Hence this would be Panel Data.

The basic regression model for a Panel Data is

$$y_{it} = b_{0it} + b_{1it} * x_{1it} + b_{2it} * x_{2it} + \dots + b_{kit} * x_{kit} + error_{it}$$

where  $y_{it}$  is the dependent variable for  $i^{th}$  cross sectional unit at  $t^{th}$  time unit.

 $b_{kit}$  is the coefficient of  $k^{th}$  independent variable in the model related to  $i^{th}$  cross sectional unit and  $t^{th}$  time unit.

error<sub>it</sub> is the error term related to i<sup>th</sup> cross sectional unit at t<sup>th</sup> time unit.

#### **Assumptions:**

- 2001 was considered as a base year for states GSDP.
- Population was available only for years 2001,2011. So a linear increase in population is assumed between 2001 ans 2011 to calculate per capita crime rate.

- 2001 year was excluded from the data as the growth rate was calculated from 2002.
- Inflation was taken into account as it has a significant effect on Growth rate.
- Data for 3 states was not available, so they were excluded from the data.

## **Data cleaning:**

- Data for various crimes is collected from the database and grouped together based on the nature of the crime and various laws applicable to that.
- All the other crimes that come under IPC were put under separate categories.
- Per Capita crime rate is calculated by dividing the crime numbers by population of the state.
- Percentage growth rate of nominal GSDP of states is calculated on a yearly basis.

#### **Dependent variable**

Financial Growth is the dependent variable and it is characterized as GDP growth. GDP is the financial estimation of the apparent multitude of finished goods and services produced by all the resident producers inside the country, usually calculated on yearly basis, and which incorporates any product taxes and excludes the subsidies in the value of the goods. Gross domestic product growth is the yearly rate development pace of GDP, The data is obtained from The Government of India database which is considered as a dependable one and which gives an enormous number of perceptions, over a huge timeframe.

## **Independent Variables**

The variables Murder, attempt to commit murder, Culpable homicide not amounting to murder, Rape, Custodial Rape, Other Rapes, Kidnapping & Abduction, Kidnapping and Abduction of Women and Girls, Kidnapping and Abduction of Others, Dacoity, Preparation and assembly to commit Dacoity, Robbery, Burglary, Theft, Auto Theft, Other Theft, Riots, Criminal Breach of Trusts, Cheating, Counterfeiting, Arson, Hurt/Grievous Hurt, Dowry death, Cruelty by husband or his relatives, Assault on woman with intent to outrage her modesty, Insult to the modesty of women and Importation of girls from foreign country, Causing Death by Negligence, Other IPC crimes: Abetment of suicide, Exposure & Abandonment, Infanticide and foeticide etc. will be independent variables. Since GDP also depends on Inflation, it will also be an independent variable.

#### **Pooled OLS method**

In this method, we assume that there is no individuality between the States/UT's. We are pooling all the observations together for running the regression. We will apply a simple OLS method.

GDPgrowthrate  $_{it} = b_0 + b_1*Inflation _{it} + b_2*MurderHomicidepercapita _{it} + b_3*RAPEpercapita _{it} + b_4*KIDNAPPINGandABDUCTIONpercapita _{it} + b_5*DACOITYRobberyTheftpercapita _{it} + b_6*RIOTSpercapita _{it} + b_7*CRIMINALBREACHOFTRUSTpercapita _{it} + b_8*CHEATINGpercapita _{it} + b_9*COUNTERFIETINGpercapita _{it} + b_{10}*ARSONpercapita _{it} +$ 

 $b_{11}*HURTGREVIOUSHURT percapita\ _{it} + b_{12}*ASSAULTONWOMEN percapita\ _{it} + b_{13}*CAUSINGDEATHBYNEGLIGENCE percapita\ _{it} + b_{14}*OTHERIPCCRIMES percapita\ _{it} + error\ _{t}$ 

Upon running the regression, the following output was obtained

```
Balanced Panel: n = 31, T = 10, N = 310
Residuals:
     Min.
             1st Qu.
                         Median
                                   3rd Qu.
-0.4649632 -0.0469904 -0.0093784 0.0387444 0.6813443
Coefficients:
                                    Estimate Std. Error t-value Pr(>|t|)
                                               0.022258 5.6119 4.614e-08 ***
(Intercept)
                                   0.124908
Inflation
                                   0.488718
                                               0.199019 2.4556 0.014640 *
                                -218.066270 207.469289 -1.0511
MurderHomicidepercapita
                                                                 0.294083
                                 800.881199 442.672529 1.8092
RAPEpercapita
                                                                 0.071438 .
KIDNAPPINGandABDUCTIONpercapita
                                  17.203091 411.180222 0.0418
                                                                 0.966656
DACOITYRobberyTheftpercapita
                                  -25.546557
                                             21.179380 -1.2062
                                                                 0.228707
                                  245.719729 151.705064 1.6197
                                                                0.106361
RIOTSpercapita
CRIMINALBREACHOFTRUSTpercapita
                                720.577410 801.078070 0.8995 0.369115
                                 187.368187 154.486516 1.2128
CHEATINGpercapita
                                                                0.226159
COUNTERFIETINGpercapita
                                -140.964234 2254.096069 -0.0625
                                                                0.950178
                                 -88.266622 782.209243 -0.1128
ARSONpercapita
                                                                0.910232
HURTGREVIOUSHURTpercapita
                                  -50.224686
                                             49.923080 -1.0060
                                                                0.315220
                                 -315.997960 115.204385 -2.7429
                                                                 0.006462 **
ASSAULTONWOMENpercapita
CAUSINGDEATHBYNEGLIGENCEpercapita 232.918092 128.286416 1.8156 0.070445
OTHERIPCCRIMESpercapita
                                  15.620714
                                              17.693172 0.8829 0.378027
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Total Sum of Squares:
                        2.751
Residual Sum of Squares: 2.5139
R-Squared:
               0.086178
Adj. R-Squared: 0.04281
F-statistic: 1.98714 on 14 and 295 DF, p-value: 0.018576
```

We have run the regression for 31 states across 10 years (2002 - 2011). The coefficient of each variable is given in the estimate column. The R squared value of the model is 0.086178 or 8.618%. The p value of the model is 0.018576 which is less than 0.05 significance from which we can infer that the model is fit. The individual p values of the variables are given in the last column from which we can say that inflation and Assault On Women per capita are significant which effect the GDP growth rate.

### **Fixed Effects Model**

In this method we consider the heterogeneity among the States/UT's. In this model the individual intercepts of the variables change over the time but the intercept remains constant.

```
GDPgrowthrate i_{tt} = b_0 + \lambda_{t} + b_{1it}*Inflation i_{tt} + b_{2it}*MurderHomicidepercapita i_{tt} + b_{3it}*RAPEpercapita i_{tt} + b_{3it}*RAPEpercapita
+ b<sub>4it</sub>*KIDNAPPINGandABDUCTIONpercapita it + b<sub>5it</sub>*DACOITYRobberyTheftpercapita it +
b<sub>6it</sub>*RIOTSpercapita<sub>it</sub> + b<sub>7it</sub>*CRIMINALBREACHOFTRUSTpercapita<sub>it</sub> + b<sub>8it</sub>*CHEATINGpercapita
it + b9it*COUNTERFIETINGpercapita it + b10it*ARSONpercapita it +
b<sub>11it</sub>*HURTGREVIOUSHURTpercapita<sub>it</sub> + b<sub>12it</sub>*ASSAULTONWOMENpercapita<sub>it</sub> +
b<sub>13it</sub>*CAUSINGDEATHBYNEGLIGENCEpercapita <sub>it</sub> + b<sub>14it</sub>*OTHERIPCCRIMESpercapita <sub>it</sub> + error
Balanced Panel: n = 31, T = 10, N = 310
Residuals:
       Min.
                1st Qu.
                              Median
                                          3rd Ou.
                                                          Max.
-0.4641434 -0.0376451 -0.0050367 0.0357662 0.5571486
Coefficients:
                                           Estimate Std. Error t-value Pr(>|t|)
Inflation
                                          -0.033516
                                                         0.265681 -0.1262 0.899707
                                       -613.027279 331.734773 -1.8479 0.065725 .
MurderHomicidepercapita
                                       1198.344483 975.537429
                                                                    1.2284 0.220389
RAPEpercapita
KIDNAPPINGandABDUCTIONpercapita
                                       1692.979131 957.621491 1.7679 0.078228 .
DACOITYRobberyTheftpercapita
                                        -54.302468
                                                       43.001630 -1.2628 0.207771
                                        375.842459 387.067542 0.9710 0.332434
RIOTSpercapita
CRIMINALBREACHOFTRUSTpercapita
                                       -453.674970 1484.733005 -0.3056 0.760180
CHEATINGpercapita
                                          68.301630 425.583757 0.1605 0.872618
COUNTERFIETINGpercapita
                                       -593.164992 2746.770674 -0.2159 0.829193
ARSONpercapita
                                          27.235507 1126.326604 0.0242 0.980727
                                        -24.488363 130.777911 -0.1873 0.851607
HURTGREVIOUSHURTpercapita
ASSAULTONWOMENpercapita
                                       -380.771101
                                                      269.901698 -1.4108 0.159483
CAUSINGDEATHBYNEGLIGENCEpercapita 1318.942006
                                                      424.292574 3.1086 0.002085 **
OTHERIPCCRIMESpercapita
                                          70.658060
                                                        44.120454 1.6015 0.110462
Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
Total Sum of Squares:
                             2.4198
Residual Sum of Squares: 2.1489
R-Squared:
                   0.11195
Adj. R-Squared: -0.035501
```

After running fixed effects model regression, we have concluded that only causing death by negligence per capita is significant in the model. As the p-value is less 0.05, the model is not random and regression done is meaningful.

F-statistic: 2.38616 on 14 and 265 DF, p-value: 0.0037962

#### **Random Effects Model**

In this model we assume that the unobserved variables are not systematically related to the the observed variables that are included in the model.

```
y_{it} = eta_0 + eta_1 x_{it1} + \ldots + eta_k x_{itk} + a_i + u_{it}, \;\; \mathrm{Cov}(x_{itj}, a_i) = 0, \quad t = 1, 2, \ldots, T; j = 1, 2, \ldots, k.
```

GDPgrowthrate  $_{it} = b_0 + b_{1it}*Inflation _{it} + b_{2it}*MurderHomicidepercapita _{it} + b_{3it}*RAPEpercapita _{it} + b_{4it}*KIDNAPPINGandABDUCTIONpercapita _{it} + b_{5it}*DACOITYRobberyTheftpercapita _{it} + b_{6it}*RIOTSpercapita _{it} + b_{7it}*CRIMINALBREACHOFTRUSTpercapita _{it} + b_{8it}*CHEATINGpercapita _{it} + b_{9it}*COUNTERFIETINGpercapita _{it} + b_{10it}*ARSONpercapita _{it} + b_{11it}*HURTGREVIOUSHURTpercapita _{it} + b_{12it}*ASSAULTONWOMENpercapita _{it} + b_{13it}*CAUSINGDEATHBYNEGLIGENCEpercapita _{it} + b_{14it}*OTHERIPCCRIMESpercapita _{it} + \alpha_t + error_{it}$ 

```
Residuals:
     Min.
             1st Qu.
                         Median
                                   3rd Qu.
                                                 Max.
-0.4592641 -0.0468804 -0.0069686 0.0366117 0.6584133
Coefficients:
                                    Estimate Std. Error z-value
                                                                  Pr(>|z|)
                                                0.025046 5.0705 3.968e-07 ***
(Intercept)
                                    0.126996
                                                0.201327 2.2029
Inflation
                                    0.443507
                                                                   0.02760 *
                                 -308.582531 232.383482 -1.3279
MurderHomicidepercapita
                                                                   0.18421
                                  884.183028 518.842092 1.7041
                                                                   0.08835 .
RAPEpercapita
KIDNAPPINGandABDUCTIONpercapita
                                  216.706508 473.253116 0.4579
                                                                   0.64702
                                              24.173497 -1.0674
DACOITYRobberyTheftpercapita
                                  -25.803813
                                                                   0.28577
                                  251.622934 182.750670 1.3769
                                                                   0.16855
RIOTSpercapita
                                 507.225759 913.653728 0.5552
CRIMINALBREACHOFTRUSTpercapita
                                                                   0.57878
                                  182.122827 186.522276 0.9764
CHEATINGpercapita
                                                                   0.32886
COUNTERFIETINGpercapita
                                                                   0.94019
                                 -177.443896 2365.035405 -0.0750
ARSONpercapita
                                  -55.302122 854.700858 -0.0647
                                                                   0.94841
HURTGREVIOUSHURTpercapita
                                 -60.150034
                                               59.122856 -1.0174
                                                                   0.30898
                                 -329.336106 136.855188 -2.4065
                                                                   0.01611 *
ASSAULTONWOMENpercapita
CAUSINGDEATHBYNEGLIGENCEpercapita 281.191101 156.510047 1.7966
                                                                   0.07239
OTHERIPCCRIMESpercapita
                                   19.774683
                                               20.834818 0.9491
                                                                   0.34256
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Total Sum of Squares:
                        2.6122
Residual Sum of Squares: 2.4018
R-Squared:
               0.08057
Adj. R-Squared: 0.036936
Chisq: 25.8511 on 14 DF, p-value: 0.027038
```

From the regression we can conclude that the inflation and Assault on Women per capita are significant. The p value of the model is 0.027 which is less than 0.05, hence the model is fit.

# Test for suitable model Pooled OLS Model

Command-

pooltest(GDPgrowthrate~Inflation+MurderHomicidepercapita+RAPEpercapita+KIDNAPPINGandAB DUCTIONpercapita+DACOITYRobberyTheftpercapita+RIOTSpercapita+CRIMINALBREACHOFT RUSTpercapita+CHEATINGpercapita,data=pdata, model= "within")

```
F statistic
```

```
data: GDPgrowthrate \sim Inflation + MurderHomicidepercapita + RAPEpercapita + ... F = 0.80979, df1 = 240, df2 = 31, p-value = 0.8079 alternative hypothesis: unstability
```

In this model our Null Hypothesis (H0) is that the model is stable and our Alternate Hypothesis (Ha) is that model is unstable. From the results the p value of the model is 0.8079 which is greater than 0.05 hence we fail to reject the null hypothesis. Hence, the model is Stable.

#### **Selection of Pooled OLS or Fixed Effect Model**

Command - pFtest(femethod,pooledmethod)

In this test our Null Hypothesis (H0) is that the pooled model is consistent and our Alternate Hypothesis (Ha) is fixed effect model is consistent. From the results the p value of the model is 0.050 which is approximately equal to 0.05 hence we reject the null hypothesis. Hence, the fixed effect model is consistent.

## Testing the presence of individual and time effects:

```
GDPgrowthrate _{it} = b_0 + b_{1it}*Inflation _{it} + b_{2it}*MurderHomicidepercapita _{it} + b_{3it}*RAPEpercapita _{it} + b_{4it}*KIDNAPPINGandABDUCTIONpercapita _{it} + b_{5it}*DACOITYRobberyTheftpercapita _{it} + b_{6it}*RIOTSpercapita _{it} + b_{7it}*CRIMINALBREACHOFTRUSTpercapita _{it} + b_{8it}*CHEATINGpercapita _{it} + b_{9it}*COUNTERFIETINGpercapita _{it} + b_{10it}*ARSONpercapita _{it} + b_{11it}*HURTGREVIOUSHURTpercapita _{it} + b_{12it}*ASSAULTONWOMENpercapita _{it} + b_{13it}*CAUSINGDEATHBYNEGLIGENCEpercapita _{it} + b_{14it}*OTHERIPCCRIMESpercapita _{it} + \pmb{\alpha}_{i} + \pmb{\lambda}_{t} + error_{it}
```

```
Lagrange Multiplier Test - two-ways effects (Gourieroux, Holly and Monfort) for balanced panels

data: GDPgrowthrate ~ Inflation + MurderHomicidepercapita + RAPEpercapita + ... chibarsq = 32.671, df0 = 0.00, df1 = 1.00, df2 = 2.00, w0 = 0.25, w1 = 0.50, w2 = 0.25, p-value = 2.557e-08 alternative hypothesis: significant effects
```

In this test the Null Hypothesis (H0) is that there is no significant individual and time effects and our Alternate Hypothesis (Ha) is that there are significant individual and time effects. From the results the p value of the model is less than 0.05 hence we reject the null hypothesis. Hence, there is a significant effect of individual and time effects on the model.

#### **Hausman Test**

Through this test we can select which model is to be followed, is it fixed effect model or random effect model

Command- phtest(femethod,remethod)

Hausman Test

```
data: GDPgrowthrate \sim Inflation + MurderHomicidepercapita + RAPEpercapita + ... chisq = 14.207, df = 14, p-value = 0.4344 alternative hypothesis: one model is inconsistent
```

In this test our Null Hypothesis (H0) is that the random effect model is consistent and our Alternate Hypothesis (Ha) is fixed effect model is consistent. From the results the p value of the model is 0.4344 which is greater than 0.05 hence we fail to reject the null hypothesis. Hence, the random effect model is consistent.

### **Test for Stationarity**

We have performed the unit root test on each independent variable and found that the variables are stationary.

Command- checkMurderHomicidepercapita = data.frame(split(crimedata\$MurderHomicidepercapita, crimedata\$STATEUT))

purtest(checkMurderHomicidepercapita, pmax = 2, exo = "intercept", test = "levinlin")

Output - Levin-Lin-Chu Unit-Root Test (ex. var.: Individual Intercepts)

data: checkMurderHomicidepercapita

z = -14.427, p-value < 2.2e-16 alternative hypothesis: stationarity

#### **Test for Autocorrelation**

We have found presence of serial correlation in the idiosyncratic errors of regression.

Command-

pdwtest(GDPgrowthrate~Inflation+MurderHomicidepercapita+RAPEpercapita+KIDNAPPINGandAB DUCTIONpercapita+DACOITYRobberyTheftpercapita+RIOTSpercapita+CRIMINALBREACHOFT RUSTpercapita+CHEATINGpercapita+COUNTERFIETINGpercapita+ARSONpercapita+HURTGRE VIOUSHURTpercapita+ASSAULTONWOMENpercapita+CAUSINGDEATHBYNEGLIGENCEpercapita+OTHERIPCCRIMESpercapita,data = pdata,model = "random")

Durbin-Watson test for serial correlation in panel models

```
data: GDPgrowthrate ~ Inflation + MurderHomicidepercapita + RAPEpercapita + KIDNAPPINGandAB DUCTIONpercapita + DACOITYRobberyTheftpercapita + RIOTSpercapita + CRIMINALBREACHOFTRUSTperc apita + CHEATINGpercapita + COUNTERFIETINGpercapita + ARSONpercapita + HURTGREVIOUSHURTperca pita + ASSAULTONWOMENpercapita + CAUSINGDEATHBYNEGLIGENCEpercapita + OTHERIPCCRIMESperca pita DW = 2.0911, p-value = 0.5826 alternative hypothesis: serial correlation in idiosyncratic errors
```

In this test our Null Hypothesis (H0) is that there is no autocorrelation in error term and our Alternate Hypothesis (Ha) is there is autocorrelation in error term. From the results the p value of the model is 0.5826 which is greater than 0.05 hence we fail to reject the null hypothesis. Hence, there is no autocorrelation in error terms.

#### **Test for Heteroskedasticity**

After doing the Breusch-Pagan test, we have found the presence of heteroskedasticity in the dataset. Command-

bptest(GDPgrowthrate~Inflation+MurderHomicidepercapita+RAPEpercapita+KIDNAPPINGandABD UCTIONpercapita+DACOITYRobberyTheftpercapita+RIOTSpercapita+CRIMINALBREACHOFTR USTpercapita+CHEATINGpercapita+COUNTERFIETINGpercapita+ARSONpercapita+HURTGRE VIOUSHURTpercapita+ASSAULTONWOMENpercapita+CAUSINGDEATHBYNEGLIGENCEperc apita+OTHERIPCCRIMESpercapita, data = pdata, studentize = F)

```
Breusch-Pagan test
```

```
data: GDPgrowthrate ~ Inflation + MurderHomicidepercapita + RAPEpercapita + KIDNAPPINGandAB DUCTIONpercapita + DACOITYRobberyTheftpercapita + RIOTSpercapita + CRIMINALBREACHOFTRUSTpercapita + CHEATINGpercapita + COUNTERFIETINGpercapita + ARSONpercapita + HURTGREVIOUSHURTpercapita + ASSAULTONWOMENpercapita + CAUSINGDEATHBYNEGLIGENCEpercapita + OTHERIPCCRIMESpercapita BP = 111.38, df = 14, p-value < 2.2e-16
```

In this test our Null Hypothesis (H0) is that there is homoscedasticity and our Alternate Hypothesis (Ha) is there is heteroscedasticity. From the results the p value of the model is less than 0.05 hence we reject the null hypothesis. Hence, there is heteroscedasticity in the model.

## **Controlling for Heteroskedasticty and Autocorrelation**

Command - coeftest(remethod,vcovHC(remethod,method = "arellano"))

## Output -

## t test of coefficients:

```
Estimate
                                                Std. Error
(Intercept)
                                      0.126996
                                                  0.018631
Inflation
                                      0.443507
                                                  0.234897
MurderHomicidepercapita
                                  -308.582531
                                                130.895538
                                    884.183028
RAPEpercapita
                                                559.461870
KIDNAPPINGandABDUCTIONpercapita
                                    216.706508
                                                336.891621
DACOITYRobberyTheftpercapita
                                    -25.803813
                                                 16.760742
RIOTSpercapita
                                    251.622934
                                                203.515068
CRIMINALBREACHOFTRUSTpercapita
                                    507.225759
                                                666.461232
CHEATINGpercapita
                                    182.122827
                                                197.625011
COUNTERFIETINGpercapita
                                   -177.443896 1716.375220
ARSONpercapita
                                   -55.302122 999.579213
HURTGREVIOUSHURTpercapita
                                    -60.150034
                                                 39.607516
ASSAULTONWOMENpercapita
                                  -329.336106 122.080629
CAUSINGDEATHBYNEGLIGENCEpercapita 281.191101
                                                160.283615
                                     19.774683
OTHERIPCCRIMESpercapita
                                                 20.747778
                                t value Pr(>|t|)
(Intercept)
                                 6.8164 5.266e-11 ***
Inflation
                                1.8881 0.059995 .
MurderHomicidepercapita
                                -2.3575
                                         0.019053 *
RAPEpercapita
                                 1.5804 0.115083
KIDNAPPINGandABDUCTIONpercapita
                                0.6433
                                        0.520560
                                -1.5395
DACOITYRobberyTheftpercapita
                                         0.124745
RIOTSpercapita
                                 1.2364
                                         0.217299
CRIMINALBREACHOFTRUSTpercapita
                                 0.7611 0.447221
CHEATINGpercapita
                                 0.9216
                                         0.357512
COUNTERFIETINGpercapita
                                -0.1034
                                         0.917729
ARSONpercapita
                                -0.0553
                                         0.955917
                                         0.129921
HURTGREVIOUSHURTpercapita
                                -1.5187
ASSAULTONWOMENpercapita
                                -2.6977
                                         0.007384 **
CAUSINGDEATHBYNEGLIGENCEpercapita 1.7543
                                         0.080411 .
OTHERIPCCRIMESpercapita
                                 0.9531 0.341320
Signif. codes:
               0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

We find that Assault on Women Per Capita is significant based on the pe value. Further, Murder and Homicide per capita, Causing death by negligence and Inflation are significant for lower levels of confidence.

## **Conclusion**

Based on the above analysis, we could include three types of crimes and inflation in our model without any loss of fit of the regression model for explaining GDP growth rate.

## **New Model**

edithedremethod=

plm(GDPgrowthrate~Inflation+MurderHomicidepercapita+ASSAULTONWOMENpercapita+CAUSI NGDEATHBYNEGLIGENCEpercapita,data=pdata, model="random")

## Output-

```
Oneway (individual) effect Random Effect Model
   (Swamy-Arora's transformation)
Call:
plm(formula = GDPgrowthrate ~ Inflation + MurderHomicidepercapita +
    ASSAULTONWOMENpercapita + CAUSINGDEATHBYNEGLIGENCEpercapita,
    data = pdata, model = "random")
Balanced Panel: n = 31, T = 10, N = 310
Effects:
                          std.dev share
                    var
idiosyncratic 0.0081374 0.0902077 0.966
              0.0002823 0.0168016 0.034
individual
theta: 0.1384
Residuals:
     Min.
            1st Qu.
                       Median
                                3rd Qu.
                                             Max.
-0.504284 -0.045069 -0.008924 0.033476 0.680464
```

```
Coefficients:
                                   Estimate Std. Error z-value Pr(>|z|)
(Intercept)
                                   0.142500
                                              0.020453 6.9672 3.233e-12 ***
                                              0.186064 3.1177 0.001823 **
Inflation
                                   0.580089
MurderHomicidepercapita
                                -229.084380 169.079709 -1.3549 0.175453
ASSAULTONWOMENpercapita
                                -165.439230 91.589973 -1.8063 0.070871 .
CAUSINGDEATHBYNEGLIGENCEpercapita 150.447533 117.043064 1.2854 0.198651
Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
Total Sum of Squares:
                       2.6657
Residual Sum of Squares: 2.5271
R-Squared:
               0.052014
Adj. R-Squared: 0.039581
Chisq: 16.7347 on 4 DF, p-value: 0.0021763
```

The new model has a lesser value of R-squared which means that the new model is not better than the previous random effect model. The p-value of the regression model has improved. As the independent variables explain less than 10% of the change in explained variable which is GDP growth rate, so it is not giving concrete and actionable insights.