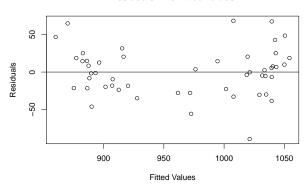
## HW<sub>3</sub>

1. Fit a model with **total** sat score as the response and **takers**, **ratio** and **salary** as predictors. The *percentage of variation* (R^2) in the response explained by the model is **82.39**%. Also, we are able to see from the summary that all B^ coefficients are significant (i.e non zero & explain variation in response) & that the assumption of constant errors (resdiudals vs fitted) seems to be satisfied. Hence, all these facts together indicate a *qood* fit.

```
##
## Call:
  lm(formula = total ~ takers + ratio + salary, data = sat)
##
## Residuals:
##
       Min
                1Q
                    Median
                                 3Q
                                        Max
##
   -89.244 -21.485
                    -0.798
                             17.685
                                     68.262
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
  (Intercept) 1057.8982
                             44.3287
                                      23.865
##
                                                <2e-16
                  -2.9134
                              0.2282
                                     -12.764
                                                <2e-16
## ratio
                  -4.6394
                              2.1215
                                      -2.187
                                                0.0339 *
## salary
                  2.5525
                                        2.541
                                                0.0145 *
                              1.0045
##
  ---
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
##
## Residual standard error: 32.41 on 46 degrees of freedom
## Multiple R-squared: 0.8239, Adjusted R-squared:
## F-statistic: 71.72 on 3 and 46 DF, p-value: < 2.2e-16
```

## Residuals v vs Fitted values



- 2. **H0**: Bsalary <=0 , **HA**: Bsalary > 0. We are going to perform a *t-test*(Bsalary/se(Bsalary) ) that follows a distribution of **t(46)** with a value of **2.541**. The *p-value* associated with this test statistics is **0.0145**. Now this is reflective of a two sided hypothesis test (i.e Bsalaray =0, or Bsalary!=0). Hence, the appropriate p-value for a one sided t test is 0.0145/2 = 0.00725, which is smaller than our alpha level 0.01. As a result, we *reject* the null hypothesis in which Bsalary<= 0, in favor of the alternative Bsalary>0.
- 3. **H0**: Bratio = 0, **HA**: Bratio != 0 .We are going to perform an *t-test*(Bratio/se(Bratio)) that follows a distribution of **t(46)** with a value of **-2.187**. The *p-value* associated with this test statistics is **0.0339**. Now this is reflective of a two sided hypothesis test (i.e Bsalaray =0, or Bsalary !=0). As a result, we fail to reject the null hypothesis in which Bsalary= 0.

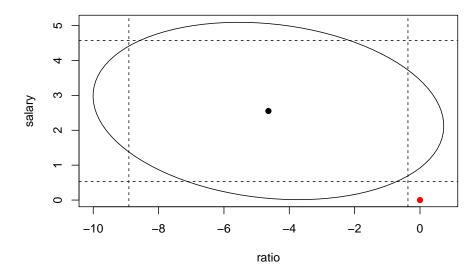
4. **H0**: Bratio=Bsalary=Btakers=0, **H1**: Btakers!=0 or Bratio!=0 or Bsalary!=0. In this model we are testing the hypthesis that at least one of the coefficients is not zero (i.e Bratio!=0). We are able to use an **F-test** with distribution **F(3, 46)** and an f-value of **71.721** which yields a p-value of ~**0**. Hence, we reject the null in favor of the alternative meaning that at least one coefficient will be significant in the model (i.e explain variance in the response).

```
## Analysis of Variance Table
##
## Model 1: total ~ 1
## Model 2: total ~ takers + ratio + salary
##
     Res.Df
               RSS Df Sum of Sq
## 1
         49 274308
## 2
             48315
                          225992 71.721 < 2.2e-16 ***
         46
                    3
## ---
                     '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
```

5. The 95% interval does not include zero, whereas the 99% interval does indeed include zero. As a result, the p-value (probability of getting a result as extreme or more as the observerd) will be contained somewhere between 0.01 and 0.05, which is indeed within reasonable alpha levels (i.e 5%).

```
## [1] 0.5305464 4.5744536
## [1] -0.1466051 5.2516051
```

6. Below is the 95% joint confidence region for the parameters associated with **ratio** and salary. The origin point (0,0) is displayed in red. The location of the origin on the plot tells us the outcome of hypothesis **H0**: Bsalary=Bratio = 0, **HA**: Bsalary or Bratio !=0. We reject the null hypothesis, at alpha = 0.05, given that the point (0,0) lies outside of the joint confidence interval.



7. For what it pertains the coefficients **takers** hasn't been affected much, and it still retains its significance. On the other side, both **ratio** and **salary** both have drammatically changed coefficients & have lost

their significance (p-value greater than any common alpha level). In terms of goodness of fit, we are still able to retain a slightier higher  $R^2$  82.46%, but given the addition of a new predictor looking at the adjusted  $R^2$  gives a better view of the data. With the adjusted  $R^2$  decreasing in comparison to the previous model. Overall, I do not see expend as improving the model.

```
##
## Call:
## lm(formula = total ~ takers + ratio + salary + expend, data = sat)
## Residuals:
##
      Min
                1Q
                   Median
                                3Q
                                       Max
  -90.531 -20.855
                   -1.746
                           15.979
                                    66.571
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 1045.9715
                            52.8698
                                    19.784 < 2e-16 ***
## takers
                 -2.9045
                             0.2313 -12.559 2.61e-16 ***
                 -3.6242
                                     -1.127
                                               0.266
## ratio
                             3.2154
## salary
                  1.6379
                             2.3872
                                      0.686
                                               0.496
                                               0.674
## expend
                  4.4626
                            10.5465
                                      0.423
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 32.7 on 45 degrees of freedom
## Multiple R-squared: 0.8246, Adjusted R-squared: 0.809
## F-statistic: 52.88 on 4 and 45 DF, p-value: < 2.2e-16
```

8. **H0**: Bratio=Bsalary=Bexpend=0 given takers, **HA**: Bratio!= 0 or Bsalary!=0 or Bexpend!=0 given takers. We can run an F-test that follows a distribution F(3, 45) which yields an F-value of **3.2133** and a p-value of **0.03165**. At an alpha level of 5%, we reject the null in favor of the alternative.

```
## Analysis of Variance Table
##
## Model 1: total ~ takers
## Model 2: total ~ takers + ratio + salary + expend
## Res.Df RSS Df Sum of Sq F Pr(>F)
## 1     48 58433
## 2     45 48124 3     10309 3.2133 0.03165 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```