

# Logistic Regression

```
##    x freq
## 1 0  199
## 2 1  201
```

## Null Model

```
##
## Call:
## glm(formula = SR ~ 1, family = "binomial", data = lm_DF)
##
## Deviance Residuals:
##      Min       1Q   Median       3Q      Max
## -1.182  -1.182   1.173   1.173   1.173
##
## Coefficients:
##              Estimate Std. Error z value Pr(>|z|)
## (Intercept)      0.01      0.10     0.1    0.92
##
## (Dispersion parameter for binomial family taken to be 1)
##
##      Null deviance: 554.51  on 399  degrees of freedom
## Residual deviance: 554.51  on 399  degrees of freedom
## AIC: 556.51
##
## Number of Fisher Scoring iterations: 3
```

## Logistic Regression: Full MModel

```
##
## Call:
## glm(formula = SR ~ ., family = "binomial", data = lm_DF)
##
## Deviance Residuals:
##      Min       1Q   Median       3Q      Max
## -2.3937  -0.8778   0.1414   0.9306   2.0267
##
## Coefficients:
##              Estimate Std. Error z value Pr(>|z|)
## (Intercept)  2.230401   1.699205   1.313  0.18931
## NASA         0.014450   0.023512   0.615  0.53885
## TA          -0.021424   0.020840  -1.028  0.30394
## EXT         -0.056071   0.056676  -0.989  0.32250
## AGR         0.036832   0.076015   0.485  0.62801
## CS          -0.069279   0.080971  -0.856  0.39222
## NT          -0.042332   0.080987  -0.523  0.60118
## OP          -0.025355   0.069074  -0.367  0.71357
## AV          0.022551   0.024553   0.918  0.35837
## EM          0.016780   0.031442   0.534  0.59357
## Task        -0.017442   0.034810  -0.501  0.61632
## H           0.014280   0.007935   1.800  0.07194 .
## RS2        -0.292905   0.248395  -1.179  0.23832
## WH2         0.100993   0.475878   0.212  0.83193
## TWR        -0.004117   0.008973  -0.459  0.64635
## BR2        -0.007057   0.251794  -0.028  0.97764
## NP2        -1.256660   0.280167  -4.485 7.28e-06 ***
## NP3        -1.858111   0.338782  -5.485 4.14e-08 ***
## FA2        -0.086435   0.320508  -0.270  0.78741
## FA3         0.408818   0.562427   0.727  0.46730
## FA4         2.939186   0.795394   3.695  0.00022 ***
## FA5         0.730857   0.715208   1.022  0.30684
## FA6         1.384358   0.528729   2.618  0.00884 **
## AP          0.170882   0.328306   0.520  0.60272
## AR         -0.103344   0.100691  -1.026  0.30473
## DWH2        -0.281804   0.428534  -0.658  0.51080
## DWR        -0.001436   0.007428  -0.193  0.84669
## T2          0.429712   0.252834   1.700  0.08921 .
## DS2        -0.351553   0.294625  -1.193  0.23278
## Rank1       -0.020893   0.339076  -0.062  0.95087
## Rank2        0.335126   0.355780   0.942  0.34622
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##      Null deviance: 554.51  on 399  degrees of freedom
## Residual deviance: 440.85  on 369  degrees of freedom
## AIC: 502.85
##
## Number of Fisher Scoring iterations: 5
```

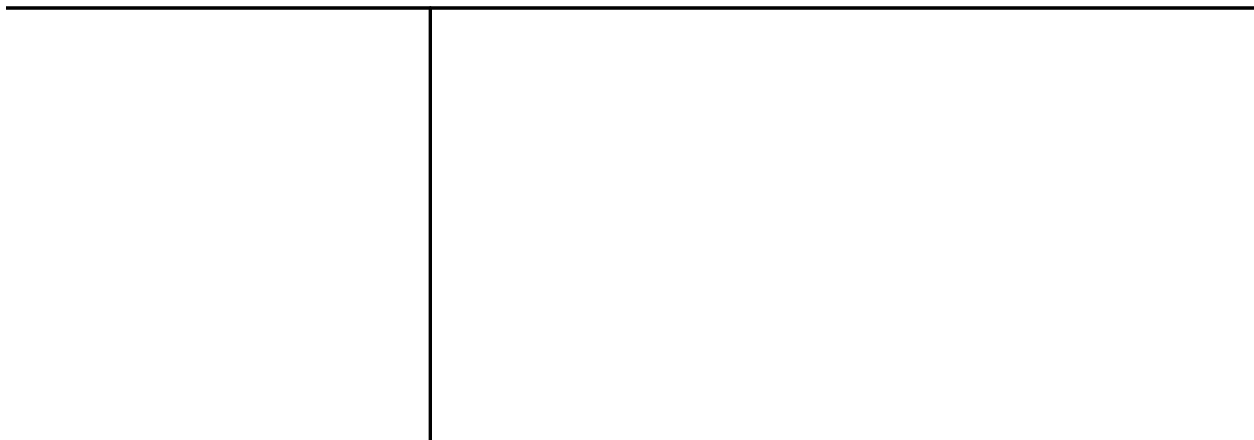
## Backward Elimination Model selection

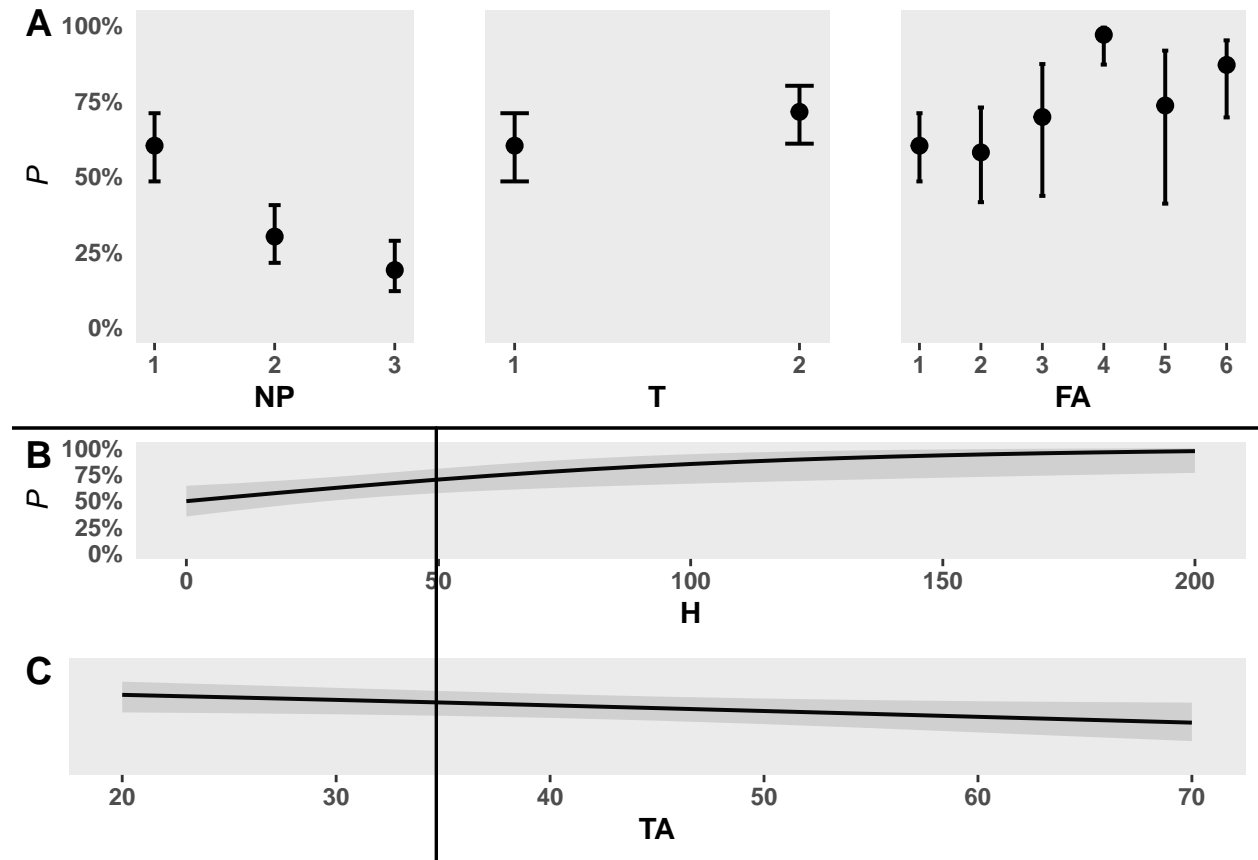
```
## Stepwise Model Path
## Analysis of Deviance Table
##
## Initial Model:
## SR ~ NASA + TA + EXT + AGR + CS + NT + OP + AV + EM + Task +
##      H + RS + WH + TWR + BR + NP + FA + AP + AR + DWH + DWR +
##      T + DS + Rank
##
## Final Model:
## SR ~ TA + H + NP + FA + T
##
##
```

	Step	Df	Deviance	Resid. Df	Resid. Dev	AIC
##	1			369	440.8513	502.8513
##	2	- Rank	2 1.509620396	371	442.3609	500.3609
##	3	- BR	1 0.001695748	372	442.3626	498.3626
##	4	- DWR	1 0.020179557	373	442.3828	496.3828
##	5	- WH	1 0.054652690	374	442.4374	494.4374
##	6	- OP	1 0.143989982	375	442.5814	492.5814
##	7	- AGR	1 0.238018918	376	442.8194	490.8194
##	8	- Task	1 0.292156478	377	443.1116	489.1116
##	9	- EM	1 0.257450629	378	443.3690	487.3690
##	10	- NT	1 0.311459566	379	443.6805	485.6805
##	11	- NASA	1 0.364744331	380	444.0452	484.0452
##	12	- DWH	1 0.447536428	381	444.4928	482.4928
##	13	- TWR	1 0.436483134	382	444.9293	480.9293
##	14	- AP	1 0.522343783	383	445.4516	479.4516
##	15	- CS	1 0.599626322	384	446.0512	478.0512
##	16	- AV	1 0.801235031	385	446.8525	476.8525
##	17	- EXT	1 0.641823048	386	447.4943	475.4943
##	18	- AR	1 1.053584227	387	448.5479	474.5479
##	19	- RS	1 1.807657749	388	450.3555	474.3555
##	20	- DS	1 1.874727682	389	452.2303	474.2303

## Backward Elimination Model

```
##
## Call:
## glm(formula = SR ~ TA + H + NP + FA + T, family = "binomial",
##      data = lm_DF)
##
## Deviance Residuals:
##      Min       1Q   Median       3Q      Max
## -2.4160  -0.8988   0.1561   0.8906   2.0568
##
## Coefficients:
##              Estimate Std. Error z value Pr(>|z|)
## (Intercept)  0.890697   0.615764   1.446  0.14804
## TA          -0.022102   0.011683  -1.892  0.05852 .
## H             0.017321   0.006592   2.628  0.00860 **
## NP2          -1.255150   0.267413  -4.694 2.68e-06 ***
## NP3          -1.859964   0.303392  -6.131 8.76e-10 ***
## FA2          -0.092050   0.305850  -0.301  0.76344
## FA3           0.419226   0.536637   0.781  0.43468
## FA4           3.057238   0.781172   3.914 9.09e-05 ***
## FA5           0.607016   0.672966   0.902  0.36706
## FA6           1.485359   0.514963   2.884  0.00392 **
## T2            0.501837   0.233954   2.145  0.03195 *
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##      Null deviance: 554.51  on 399  degrees of freedom
## Residual deviance: 452.23  on 389  degrees of freedom
## AIC: 474.23
##
## Number of Fisher Scoring iterations: 5
```





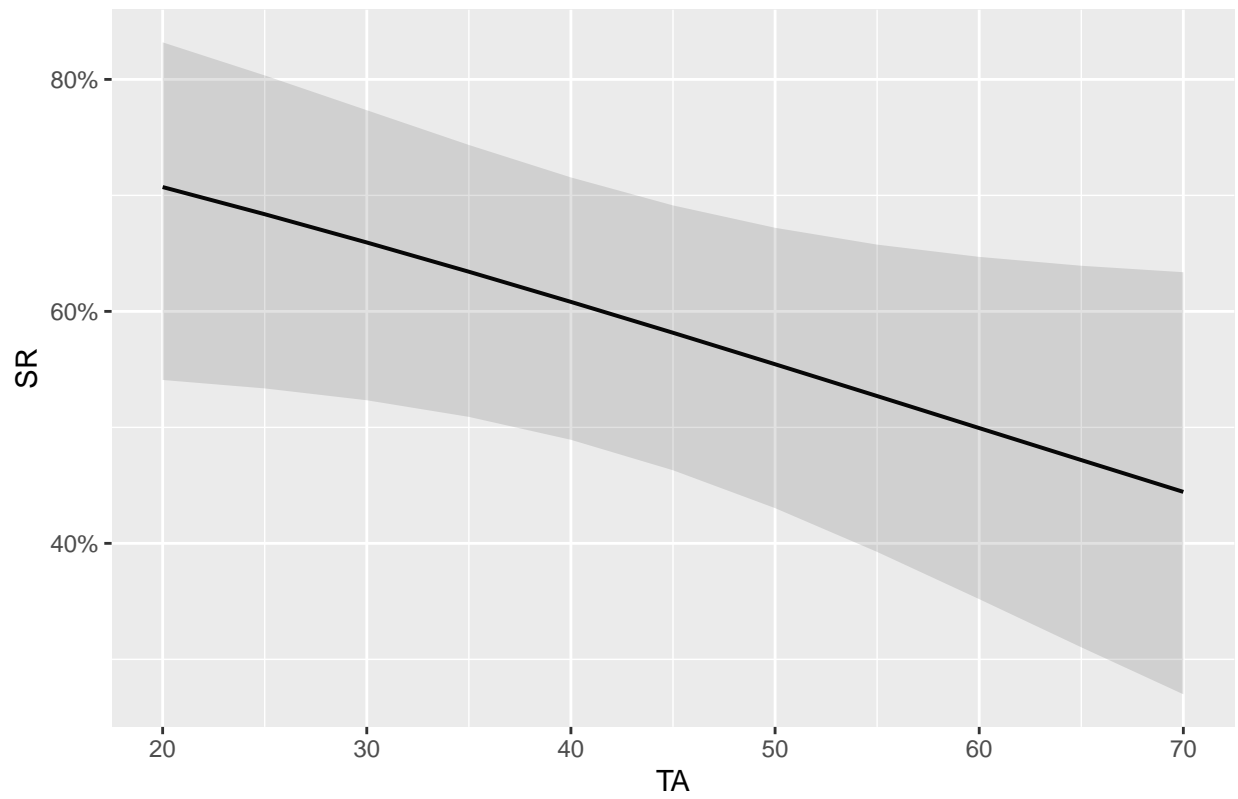
## Data were 'prettified'. Consider using `terms="TA [all]"` to get smooth plots.

## Data were 'prettified'. Consider using `terms="H [all]"` to get smooth plots.

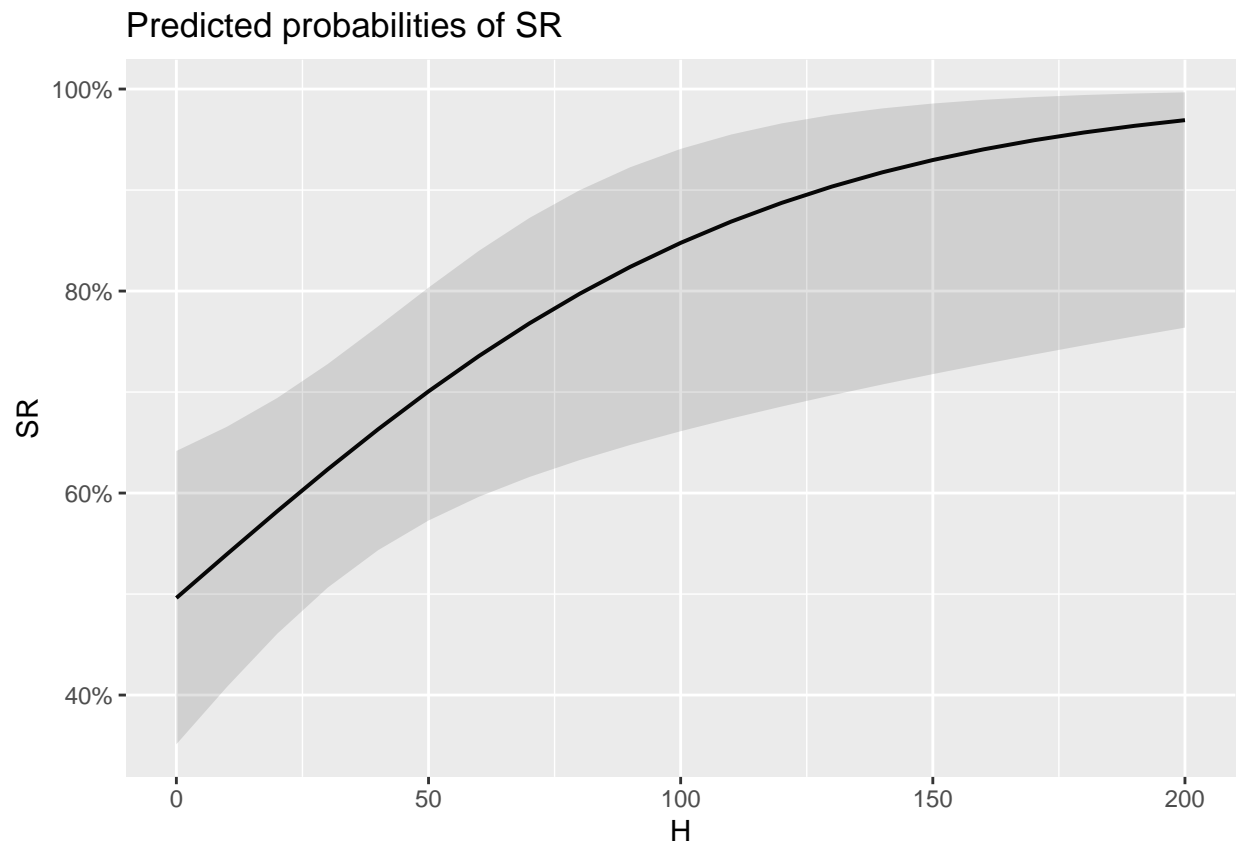
## \$TA



Predicted probabilities of SR

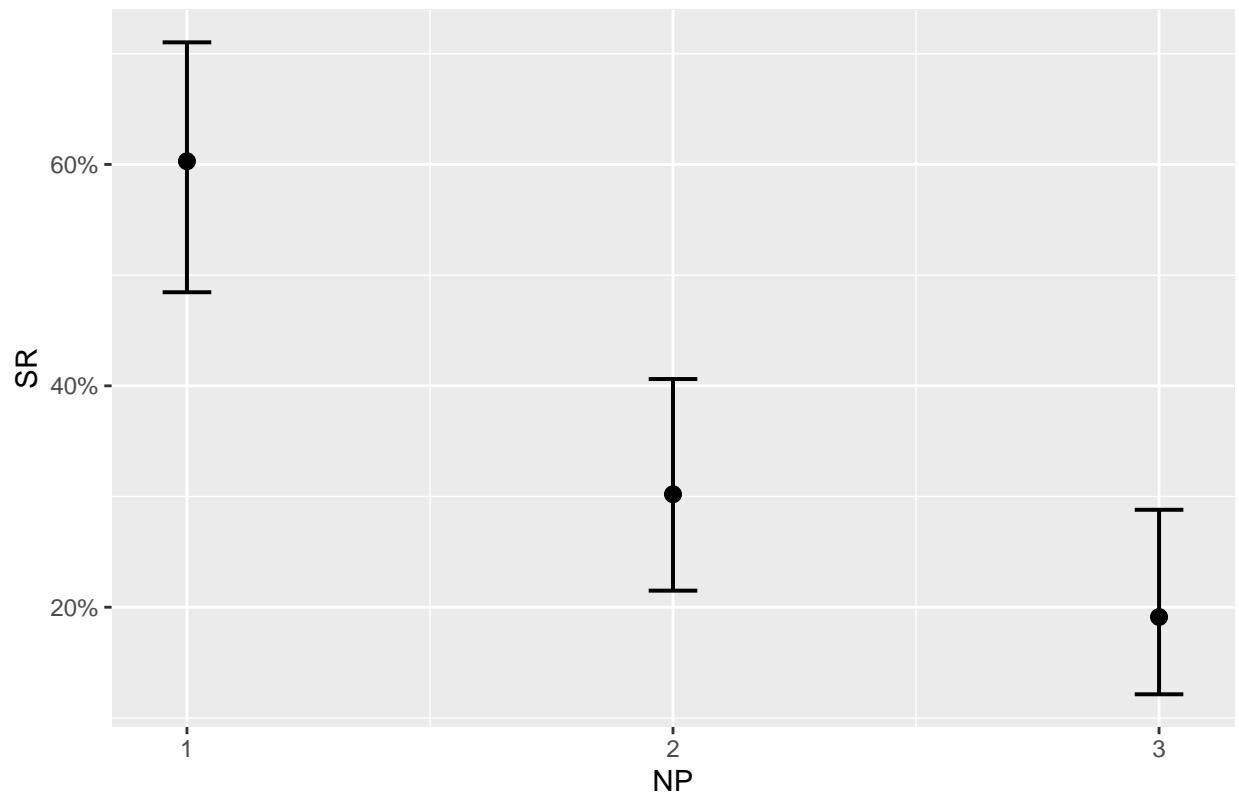


##  
## \$H

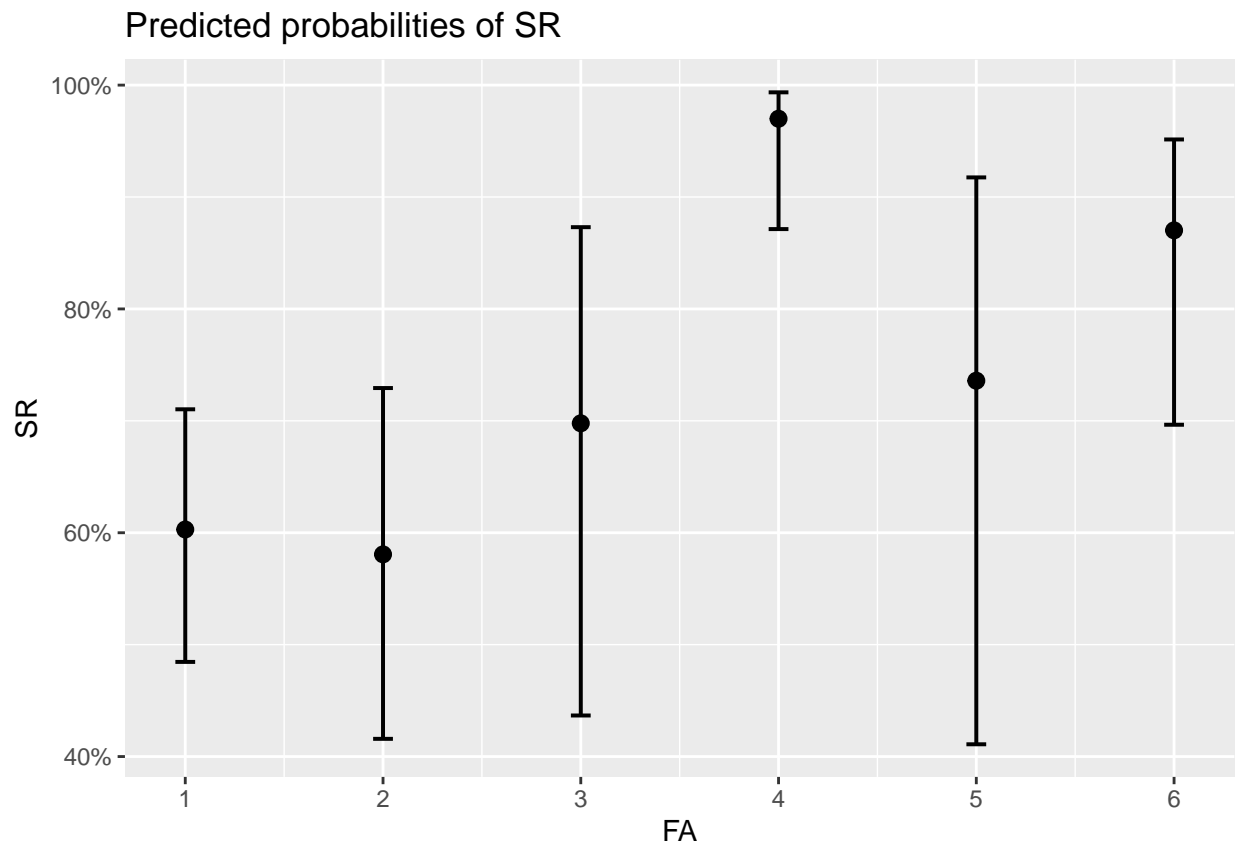


##  
## \$NP

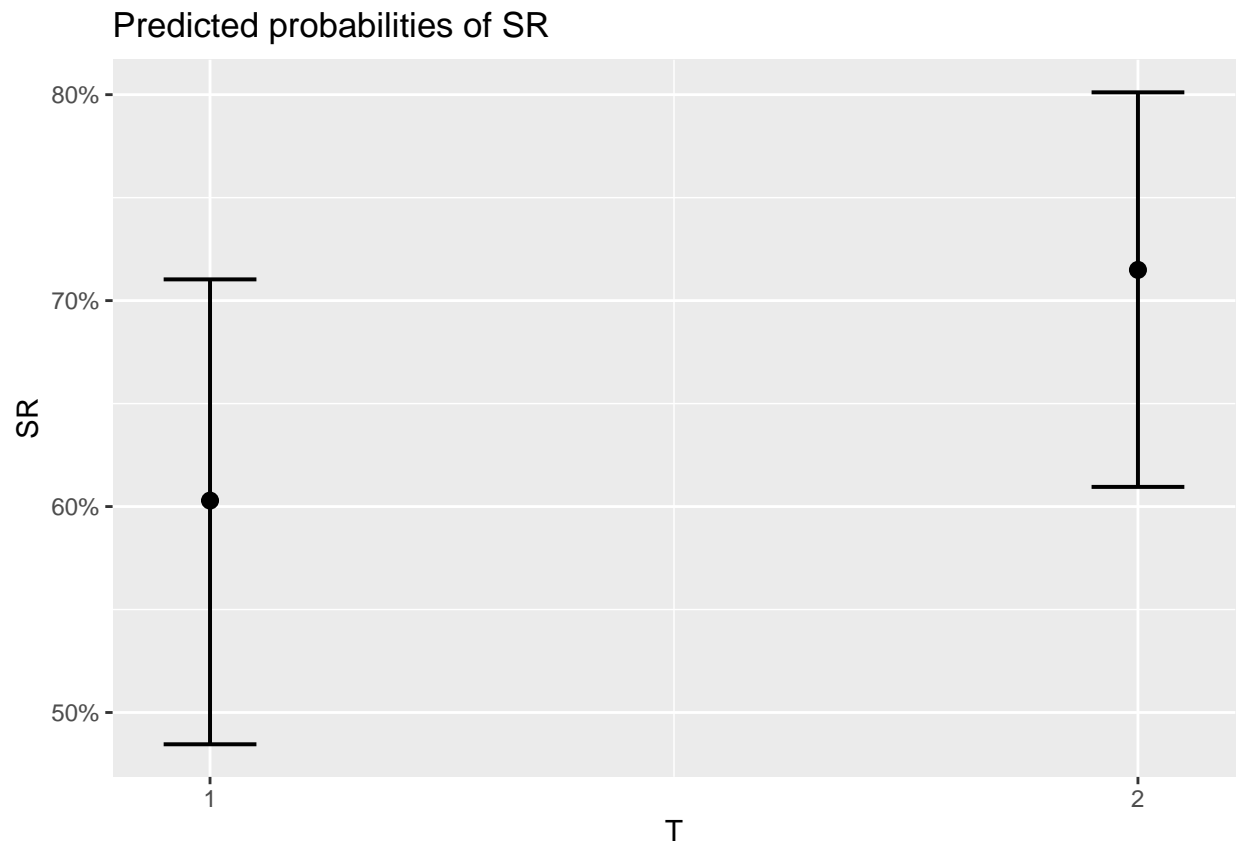
Predicted probabilities of SR



##  
## \$FA



##  
## \$T



## Comparing Models

```
## Analysis of Deviance Table
##
## Model 1: SR ~ 1
## Model 2: SR ~ TA + H + NP + FA + T
## Model 3: SR ~ NASA + TA + EXT + AGR + CS + NT + OP + AV + EM + Task +
##      H + RS + WH + TWR + BR + NP + FA + AP + AR + DWH + DWR +
##      T + DS + Rank
##      Resid. Df Resid. Dev Df Deviance Pr(>Chi)
## 1          399      554.51
## 2          389      452.23 10   102.277   <2e-16 ***
## 3          369      440.85 20    11.379    0.9358
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

## Forward Selection

```
## Stepwise Model Path
## Analysis of Deviance Table
##
## Initial Model:
## SR ~ 1
##
## Final Model:
## SR ~ NP + FA + H + T + TA
##
##
```

##	Step	Df	Deviance	Resid. Df	Resid. Dev	AIC
##	1			399	554.5077	556.5077
##	2 + NP	2	49.974377	397	504.5334	510.5334
##	3 + FA	5	32.089198	392	472.4442	488.4442
##	4 + H	1	10.671741	391	461.7724	479.7724
##	5 + T	1	5.916505	390	455.8559	475.8559
##	6 + TA	1	3.625665	389	452.2303	474.2303

## Forward Selection model

```
##
## Call:
## glm(formula = SR ~ NP + DS + H + RS + FA + TA + Rank, family = "binomial",
##      data = lm_DF)
##
## Deviance Residuals:
##      Min       1Q   Median       3Q      Max
## -2.3666  -0.8675   0.1765   0.9412   2.0583
##
## Coefficients:
##              Estimate Std. Error z value Pr(>|z|)
## (Intercept)  1.397685   0.671843   2.080 0.037491 *
## NP2         -1.251189   0.269550  -4.642 3.45e-06 ***
## NP3         -1.921629   0.310684  -6.185 6.20e-10 ***
## DS2         -0.468718   0.257104  -1.823 0.068294 .
## H            0.012569   0.007497   1.677 0.093631 .
## RS2         -0.288276   0.241397  -1.194 0.232400
## FA2         -0.047295   0.305380  -0.155 0.876921
## FA3          0.390359   0.547148   0.713 0.475572
## FA4          2.888785   0.780073   3.703 0.000213 ***
## FA5          0.707990   0.705013   1.004 0.315271
## FA6          1.501650   0.514687   2.918 0.003527 **
## TA          -0.016160   0.012270  -1.317 0.187834
## Rank1        0.005325   0.326935   0.016 0.987005
## Rank2        0.339018   0.344117   0.985 0.324534
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##      Null deviance: 554.51  on 399  degrees of freedom
## Residual deviance: 450.15  on 386  degrees of freedom
## AIC: 478.15
##
## Number of Fisher Scoring iterations: 5
```



## Comparing Models

```
## Analysis of Deviance Table
##
## Model 1: SR ~ 1
## Model 2: SR ~ TA + H + NP + FA + T
## Model 3: SR ~ NP + DS + H + RS + FA + TA + Rank
## Model 4: SR ~ NASA + TA + EXT + AGR + CS + NT + OP + AV + EM + Task +
##      H + RS + WH + TWR + BR + NP + FA + AP + AR + DWH + DWR +
##      T + DS + Rank
##   Resid. Df Resid. Dev Df Deviance Pr(>Chi)
## 1         399      554.51
## 2         389      452.23 10   102.277  <2e-16 ***
## 3         386      450.15  3     2.082   0.5556
## 4         369      440.85 17     9.297   0.9305
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

## Step\_wise method

```
## Stepwise Model Path
## Analysis of Deviance Table
##
## Initial Model:
## SR ~ 1
##
## Final Model:
## SR ~ NP + FA + H + T + TA
##
##
##   Step Df  Deviance Resid. Df Resid. Dev    AIC
## 1
## 2 + NP  2 49.974377      397   504.5334 510.5334
## 3 + FA  5 32.089198      392   472.4442 488.4442
## 4  + H  1 10.671741      391   461.7724 479.7724
## 5  + T  1  5.916505      390   455.8559 475.8559
## 6 + TA  1  3.625665      389   452.2303 474.2303
##
##
## Call:
## glm(formula = SR ~ NP + FA + H + T + TA, family = "binomial",
##      data = lm_DF)
##
## Deviance Residuals:
##      Min       1Q   Median       3Q      Max
## -2.4160  -0.8988   0.1561   0.8906   2.0568
##
## Coefficients:
##              Estimate Std. Error z value Pr(>|z|)
## (Intercept)  0.890697   0.615764   1.446  0.14804
## NP2          -1.255150   0.267413  -4.694 2.68e-06 ***
## NP3          -1.859964   0.303392  -6.131 8.76e-10 ***
## FA2          -0.092050   0.305850  -0.301  0.76344
## FA3           0.419226   0.536637   0.781  0.43468
## FA4           3.057238   0.781172   3.914 9.09e-05 ***
## FA5           0.607016   0.672966   0.902  0.36706
## FA6           1.485359   0.514963   2.884  0.00392 **
## H             0.017321   0.006592   2.628  0.00860 **
## T2            0.501837   0.233954   2.145  0.03195 *
## TA           -0.022102   0.011683  -1.892  0.05852 .
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##      Null deviance: 554.51  on 399  degrees of freedom
## Residual deviance: 452.23  on 389  degrees of freedom
## AIC: 474.23
##
## Number of Fisher Scoring iterations: 5
```

## Comparing models

```
## Analysis of Deviance Table
##
## Model 1: SR ~ 1
## Model 2: SR ~ TA + H + NP + FA + T
## Model 3: SR ~ NP + DS + H + RS + FA + TA + Rank
## Model 4: SR ~ NP + FA + H + T + TA
## Model 5: SR ~ NASA + TA + EXT + AGR + CS + NT + OP + AV + EM + Task +
##      H + RS + WH + TWR + BR + NP + FA + AP + AR + DWH + DWR +
##      T + DS + Rank
##   Resid. Df Resid. Dev Df Deviance Pr(>Chi)
## 1         399      554.51
## 2         389      452.23 10   102.277  <2e-16 ***
## 3         386      450.15  3     2.082   0.5556
## 4         389      452.23 -3    -2.082   0.5556
## 5         369      440.85 20    11.379   0.9358
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

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