

Analyze the various factors  
that influences an employee  
to Exit the company

# Variable Description

## Numeric Type:

|                        |                 |
|------------------------|-----------------|
| Satisfaction Level     | 0 - 1(Rating)   |
| Last Evaluation        | 0 – 1(Rating)   |
| Average Monthly Hours  | 96 – 310(Hours) |
| Time Spend in Company  | 2 – 10(Years)   |
| Number of Projects     | 2 – 7(Count)    |
| Promotion Last 5 Years | 0/1(No/Yes)     |
| Work Accidents         | 0/1(No/Yes)     |

## Character Type:

|            |   |
|------------|---|
| Salary     | High/Medium/Low   |
| Department | Accounting/ HR/ IT/ Management/ Marketing/<br>Product Management/ R & D/ Sales/ Support/<br>Technical |
| Exit       | 0/1(No/Yes)   |

start

Response Variable: EXIT (Binary)

Convert the categorical variables  
into Dummy variables  
(n-1 Dummies to evade the  
dummy variable trap)

Perform  
Logistic  
Regression

Chi-Square test statistic

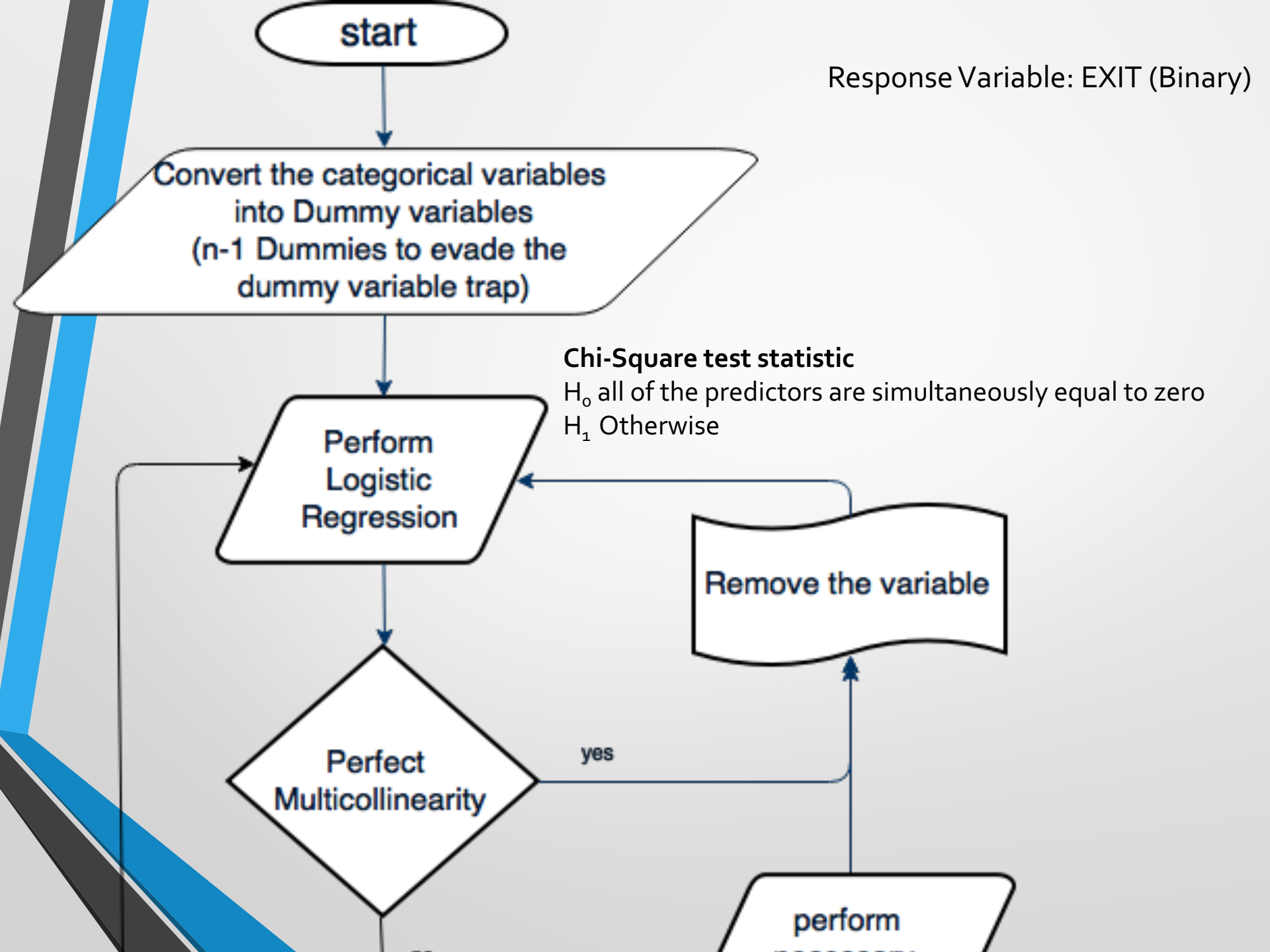
$H_0$  all of the predictors are simultaneously equal to zero  
 $H_1$  Otherwise

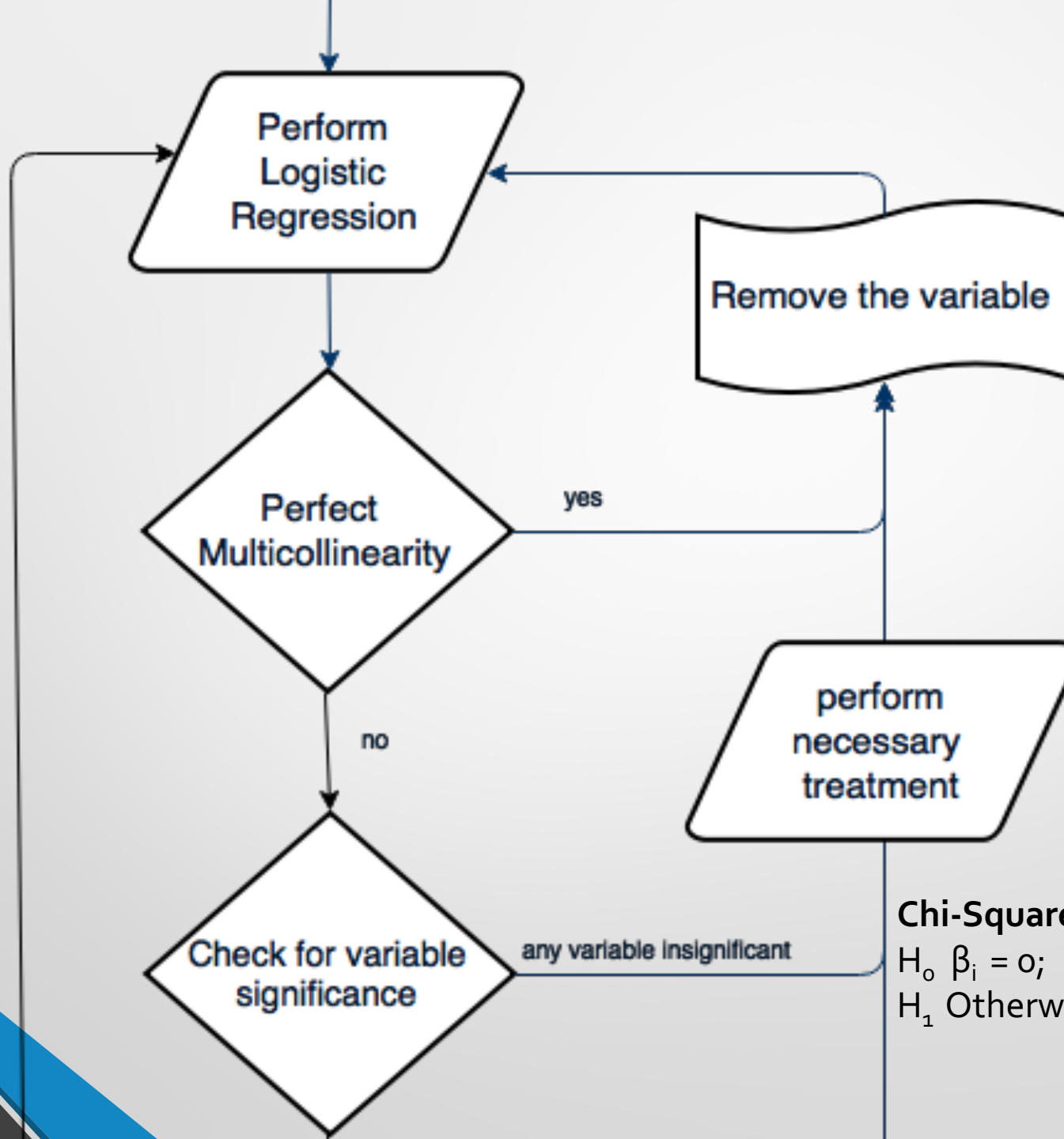
Remove the variable

Perfect  
Multicollinearity

yes

perform

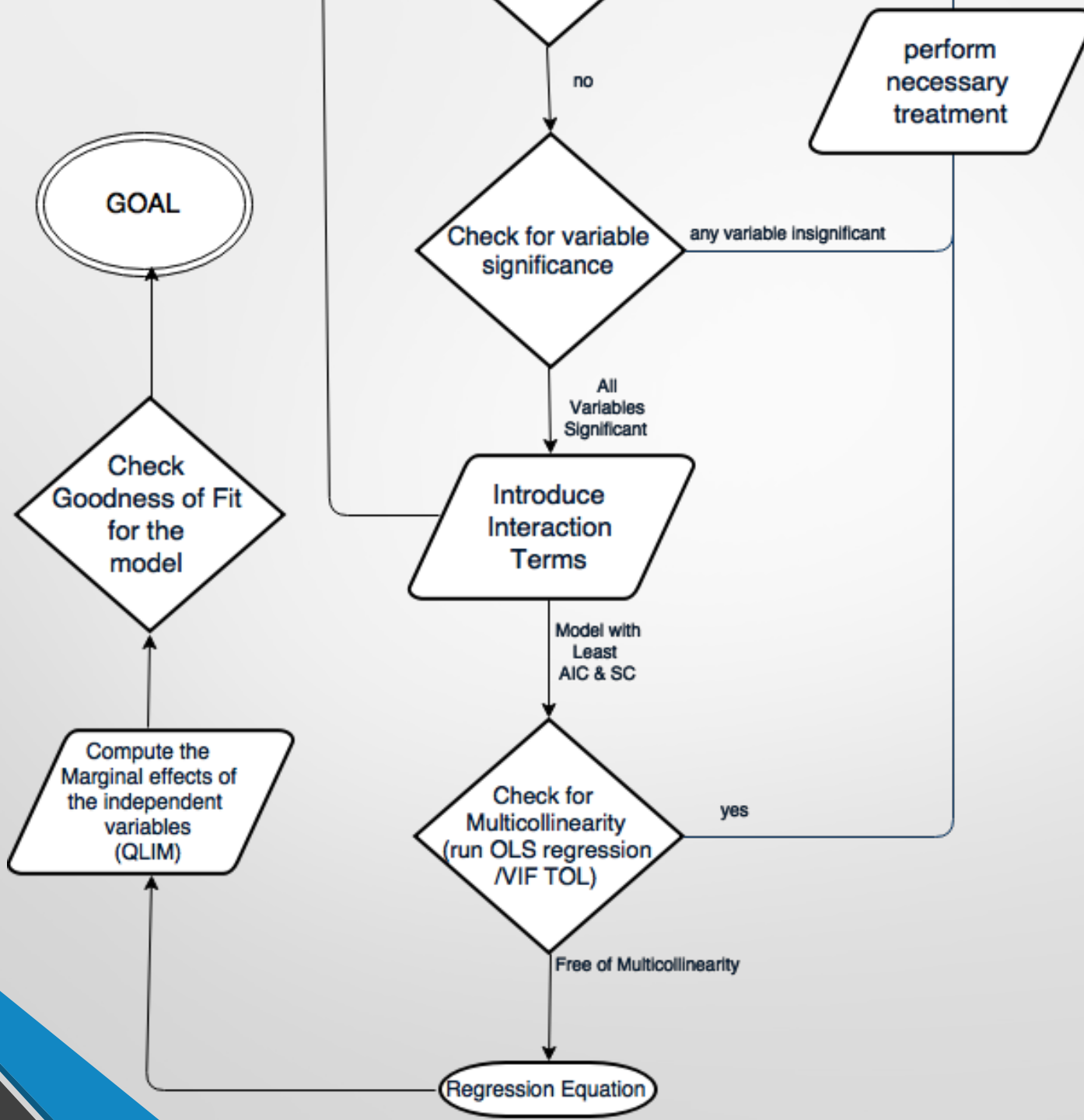




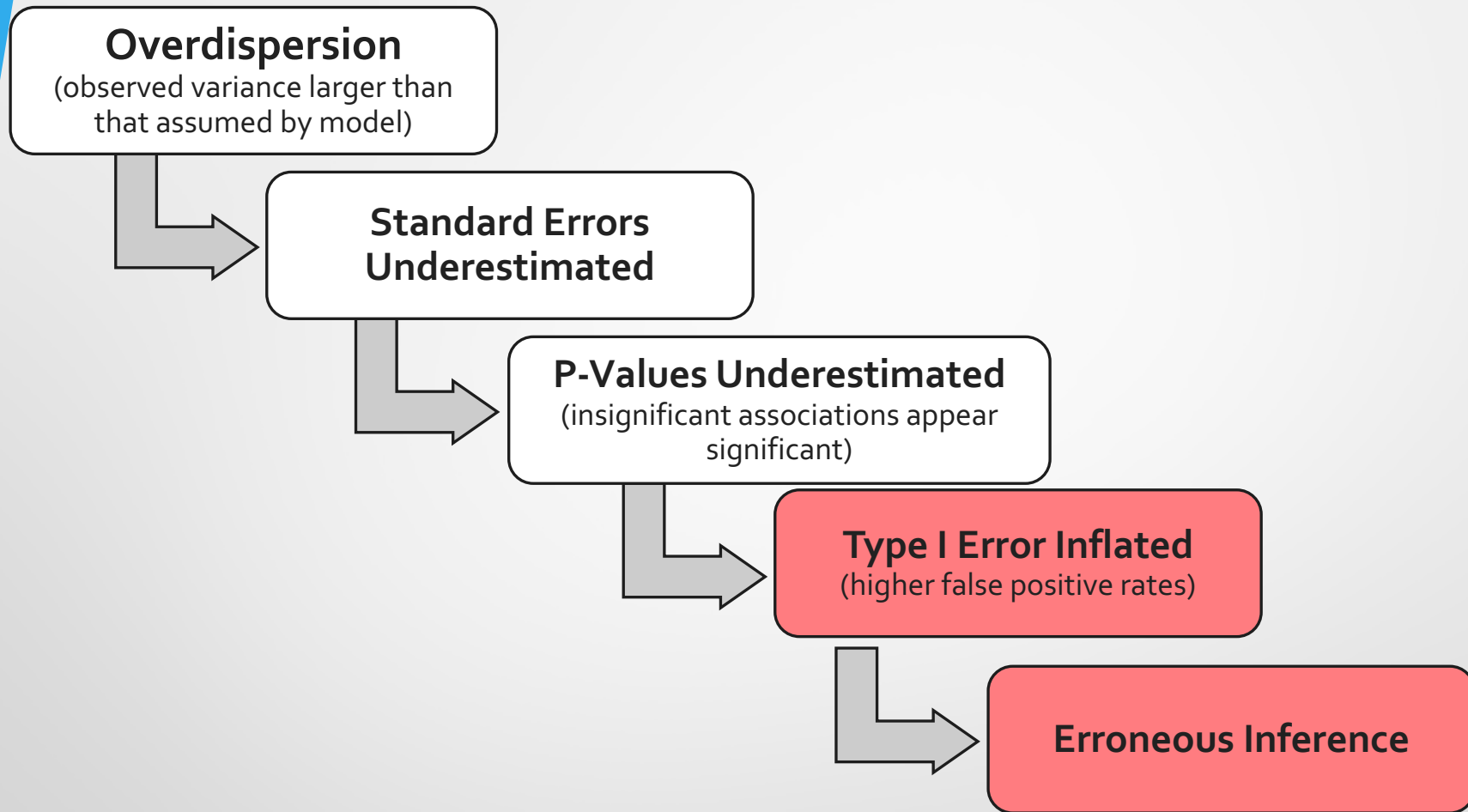
**Chi-Square test statistic**

$H_0: \beta_i = 0;$

$H_1: \text{Otherwise}$



# Dispersion and issues associated with it.



# Final Model Statistics

Probability modeled is EXIT='1'.

## Model Convergence Status

Convergence criterion (GCONV=1E-8) satisfied.

## Model Fit Statistics

| Criterion | Intercept Only | Intercept and Covariates |
|-----------|----------------|--------------------------|
| AIC       | 16466.691      | 11552.679                |
| SC        | 16474.306      | 11697.378                |
| -2 Log L  | 16464.691      | 11514.679                |

## Testing Global Null Hypothesis: BETA=0

| Test             | Chi-Square | DF | Pr > ChiSq |
|------------------|------------|----|------------|
| Likelihood Ratio | 4950.0117  | 18 | <.0001     |
| Score            | 4144.3431  | 18 | <.0001     |
| Wald             | 2721.4398  | 18 | <.0001     |

## Analysis of Maximum Likelihood Estimates

| Parameter             | DF | Estimate | Standard Error | Wald Chi-Square | Pr > ChiSq | Standardized Estimate |
|-----------------------|----|----------|----------------|-----------------|------------|-----------------------|
| Intercept             | 1  | -5.3282  | 0.2653         | 403.3326        | <.0001     |                       |
| satisfaction_level    | 1  | -4.9141  | 0.1330         | 1365.0326       | <.0001     | -0.6736               |
| last_evaluation       | 1  | 6.5504   | 0.2823         | 538.3373        | <.0001     | 0.6182                |
| number_project        | 1  | -0.2447  | 0.0229         | 114.1295        | <.0001     | -0.1663               |
| average_monthly_hours | 1  | 0.00624  | 0.000561       | 123.4768        | <.0001     | 0.1718                |
| time_spend_company    | 1  | 0.3496   | 0.0185         | 355.2075        | <.0001     | 0.2814                |
| Work_accident         | 1  | -1.5779  | 0.0943         | 279.8774        | <.0001     | -0.3060               |
| promotion_last_5year  | 1  | -1.2914  | 0.2596         | 24.7432         | <.0001     | -0.1027               |
| salary_high           | 1  | -1.2679  | 0.1684         | 56.6876         | <.0001     | -0.1923               |
| salary_mid            | 1  | -0.1432  | 0.0773         | 3.4339          | 0.0639     | -0.0391               |
| salary_high*dept_hr   | 1  | 1.6372   | 0.5354         | 9.3516          | 0.0022     | 0.0494                |
| salary_mid*dept_hr    | 1  | 0.7778   | 0.1431         | 29.5280         | <.0001     | 0.0655                |
| dept_hr*sat_low       | 1  | -0.7892  | 0.2421         | 10.6295         | 0.0011     | -0.0352               |
| salary_mid*sat_low    | 1  | -1.1425  | 0.1293         | 78.0533         | <.0001     | -0.1441               |
| salary_high*sat_low   | 1  | -1.1897  | 0.3296         | 13.0318         | 0.0003     | -0.0617               |
| salary_mid*sat_mid    | 1  | -0.4537  | 0.0912         | 24.7621         | <.0001     | -0.0916               |
| salary_hig*eval_high  | 1  | -1.0542  | 0.2748         | 14.7212         | 0.0001     | -0.1249               |
| time_low*eval_mid     | 1  | -0.8675  | 0.3351         | 6.7029          | 0.0096     | -0.1322               |
| eval_mid*time_mid     | 1  | 2.8599   | 0.1045         | 749.1499        | <.0001     | 0.7176                |



# Goodness of Fit

| Classification Table |         |           |           |           |             |              |              |           |           |
|----------------------|---------|-----------|-----------|-----------|-------------|--------------|--------------|-----------|-----------|
| Prob Level           | Correct |           | Incorrect |           | Percentages |              |              |           |           |
|                      | Event   | Non-Event | Event     | Non-Event | Correct     | Sensi-tivity | Speci-ficity | False POS | False NEG |
| 0.450                | 2049    | 10314     | 1114      | 1522      | 82.4        | 57.4         | 90.3         | 35.2      | 12.9      |

## Logit Marginal Effects

### The MEANS Procedure

| Variable                      | Label   | Mean        | Std Dev     |
|-------------------------------|---|-------------|-------------|
| Meff_P2_satisfaction_level    | Marginal effect of satisfaction_level on the probability of EXIT=2    | -0.6077340  | 0.4314674   |
| Meff_P2_last_evaluation       | Marginal effect of last_evaluation on the probability of EXIT=2       | 0.8115537   | 0.5761715   |
| Meff_P2_number_project        | Marginal effect of number_project on the probability of EXIT=2        | -0.0302697  | 0.0214903   |
| Meff_P2_average_monthly_hours | Marginal effect of average_monthly_hours on the probability of EXIT=2 | 0.000770648 | 0.000547130 |
| Meff_P2_time_spend_company    | Marginal effect of time_spend_company on the probability of EXIT=2    | 0.0431890   | 0.0306625   |
| Meff_P2_Work_accident         | Marginal effect of Work_accident on the probability of EXIT=2         | -0.1950544  | 0.1384810   |
| Meff_P2_promotion_last_5years | Marginal effect of promotion_last_5years on the probability of EXIT=2 | -0.1613746  | 0.1145697   |
| Meff_P2_salary_high           | Marginal effect of salary_high on the probability of EXIT=2           | -0.1552084  | 0.1101919   |
| Meff_P2_salary_mid            | Marginal effect of salary_mid on the probability of EXIT=2            | -0.0176905  | 0.0125595   |
| Meff_P2_salary_high_dept_hr   | Marginal effect of salary_high_dept_hr on the probability of EXIT=2   | 0.1657540   | 0.1176789   |
| Meff_P2_salary_mid_dept_hr    | Marginal effect of salary_mid_dept_hr on the probability of EXIT=2    | 0.0962760   | 0.0683522   |
| Meff_P2_dept_hr_sat_low       | Marginal effect of dept_hr_sat_low on the probability of EXIT=2       | -0.0967689  | 0.0687021   |
| Meff_P2_salary_mid_sat_low    | Marginal effect of salary_mid_sat_low on the probability of EXIT=2    | -0.1412442  | 0.1002778   |
| Meff_P2_salary_high_sat_low   | Marginal effect of salary_high_sat_low on the probability of EXIT=2   | -0.1494416  | 0.1060977   |
| Meff_P2_salary_mid_sat_mid    | Marginal effect of salary_mid_sat_mid on the probability of EXIT=2    | -0.0560504  | 0.0397936   |
| Meff_P2_salary_high_eval_high | Marginal effect of salary_high_eval_high on the probability of EXIT=2 | -0.1267102  | 0.0899593   |
| Meff_P2_time_low_eval_mid     | Marginal effect of time_low_eval_mid on the probability of EXIT=2     | -0.1015953  | 0.0721287   |
| Meff_P2_eval_mid_time_mid     | Marginal effect of eval_mid_time_mid on the probability of EXIT=2     | 0.3540741   | 0.2513788   |

| Variable | Label                 | N     | Mean      | Std Dev   | Minimum     | Maximum   |
|----------|-----------------------|-------|-----------|-----------|-------------|-----------|
| EXIT     |                       | 14999 | 0.2380825 | 0.4259241 | 0           | 1.0000000 |
| pred     | Estimated Probability | 14999 | 0.2380828 | 0.2404759 | 0.000111658 | 0.9761757 |



# Conclusion

Our Model demonstrated a predictive accuracy of classifying 82.4%.

Factors significantly motivating the Employee not to Exit the company:

- Satisfaction Level
- Work Accident
- Promotion Last 5 Years
- Salary High
- Salary high & Satisfaction Low
- Salary mid & Satisfaction Low
- Salary high & High Last Evaluation
- Low Time spend in company & Mid Last Evaluation

Factors significantly motivating the employee to Exit the company:

- High Salary & HR Department
- Mid Last Evaluation and Mid Time spend in company
- Last Evaluation

# References

Data Source: [Kaggle Dataset](#)

Logistic Model – [Link](#)

Heteroscedasticity in Logistic Regression

- Discussion by Maarten – [Link](#)
- Discussion by Dale McLerran - [Link](#)

Over-dispersion

- Jessica Harwood, UCLA – [Link](#)
- SAS Support – [Link](#)
- Theory and Adjustment - [Link](#)

Thank You