## Machine Learning Analysis

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1. Which machine learning technique will you use?

Logistical regression is a way to fit a regression curve where y = f(x). This model is used to predict y given a set of predictors x. The predictors in this model can be continuous, categorical or a mix of both. I am using categorical predictors for my model.

I am using a binominal logistic regression because y is binary, it can only be 1 or 0. Given a set of attributes for each person in the census such as education level, occupation, marital status and class of work, the algorithm should decide whether the person makes less than \$50,000 (1) or more than \$50,000 (0).

1. How do you frame your main question as a machine learning problem? Is it a supervised or unsupervised problem? If it is supervised, is it a regression or a classification?

Binominal logistical regression is a supervised machine learning problem. We have both, the independent variables, and the dependent variables. The independent variables in my model are class of work, education level, occupation, and marital status. The dependent variable is whether the income is over \$50,000 or under \$50,000.

The model is considered a classification predictive model. There are two classes that are being predicted, over \$50,000 and under \$50,000.

1. What are the main features (also called independent variables or predictors) that you'll use?

Each independent variable has a different number of features.

Marital status includes 7 classifications. They are Married to a civilian, Married to an armed forces spouse, Married but not together, Divorced, Separated, Widowed, or Never married.

Education includes 16 classifications. They are Preschool, 1<sup>st</sup> to 4<sup>th</sup> grade, 5<sup>th</sup> to 6<sup>th</sup> grade, 7<sup>th</sup> to 8<sup>th</sup> grade, 9<sup>th</sup> grade, 10<sup>th</sup> grade, 11<sup>th</sup> grade, 12<sup>th</sup> grade, High school graduate, Some college, Vocational associates degree, Academic associates degree, Professional school, Bachelor's degree, Master's degree, and Doctorate degree.

Occupation includes 14 classifications. They are Administrational-clerical, Armed Forces, Craft repair, Executive-managerial, Farming-fishing, Handlers-cleaners, Machine operator-inspector, Other service, Private house service, Professional-specialty, Protective service, Sales, Techsupport, Transportation-moving.

Working class includes 8 classifications. They are Federal government, Local government, Never worked, Private, Self-employed incorporation, Self-employed not incorporated, State government, Without pay.

```
> model <- glm(LessThen_50 ~ WorkClass + Education + MaritalStatus + Occupati</pre>
on,family=binomial(link='logit'),data=income_data_f)
> summary(model)
call:
glm(formula = LessThen_50 ~ WorkClass + Education + MaritalStatus +
    Occupation, family = binomial(link = "logit"), data = income_data_f)
Deviance Residuals:
    Min
              10
                   Median
                                 3Q
                                         Max
-3.4495
          0.0793
                   0.2575
                            0.5845
                                      2.4744
Coefficients: (1 not defined because of singularities)
                                     Estimate Std. Error z value Pr(>|z|)
                                      4.27902
(Intercept)
                                                 0.17282
                                                          24.760
                                                                  < 2e-16 ***
WorkClassFederal-gov
                                                                  < 2e-16 ***
                                     -1.18550
                                                 0.13953
                                                          -8.496
WorkClassLocal-gov
                                                          -3.697 0.000218 ***
                                     -0.46962
                                                 0.12701
WorkClassNever-worked
                                     11.11977
                                               291.15371
                                                           0.038 0.969535
WorkClassPrivate
                                     -0.63769
                                                 0.11185
                                                          -5.701 1.19e-08 ***
WorkClassSelf-emp-inc
                                                                 < 2e-16 ***
                                     -1.17868
                                                 0.13480
                                                          -8.744
WorkClassSelf-emp-not-inc
                                                          -3.026 0.002477 **
                                     -0.37428
                                                 0.12368
WorkClassState-gov
                                     -0.20785
                                                 0.13854
                                                          -1.500 0.133535
WorkClassWithout-pav
                                    12.10596 204.23048
                                                           0.059 0.952732
Education11th
                                      0.06519
                                                 0.19738
                                                           0.330 0.741206
                                     -0.37086
Education12th
                                                 0.24104
                                                          -1.539 0.123912
Education1st-4th
                                      0.77263
                                                 0.44883
                                                           1.721 0.085175
Education5th-6th
                                      0.41805
                                                 0.29798
                                                           1.403 0.160637
Education7th-8th
                                      0.42443
                                                 0.21885
                                                           1.939 0.052455
Education9th
                                      0.36928
                                                 0.24855
                                                           1.486 0.137350
                                                          -7.601 2.94e-14 ***
EducationAssoc-acdm
                                     -1.24185
                                                 0.16338
EducationAssoc-voc
                                     -1.24731
                                                 0.15676
                                                          -7.957 1.76e-15 ***
                                                                  < 2e-16 ***
EducationBachelors
                                     -1.91459
                                                 0.14578 -13.134
                                                                  < 2e-16 ***
EducationDoctorate
                                     -3.30344
                                                 0.19957 -16.553
                                                          -5.184 2.17e-07 ***
EducationHS-grad
                                     -0.73860
                                                 0.14247
                                                                   < 2e-16 ***
EducationMasters
                                     -2.42527
                                                 0.15565 -15.582
                                               106.24244
                                                           0.108 0.914298
EducationPreschool
                                    11.43366
                                                 0.18512 -16.912 < 2e-16 ***
EducationProf-school
                                     -3.13069
```

```
0.14429 -7.236 4.63e-13 ***
EducationSome-college
                                    -1.04403
                                                         -5.169 2.35e-07 ***
MaritalStatusMarried-AF-spouse
                                    -2.39984
                                                0.46428
                                                0.05675 -36.717 < 2e-16 ***
MaritalStatusMarried-civ-spouse
                                    -2.08355
MaritalStatusMarried-spouse-absent
                                                0.19953
                                                          0.601 0.547608
                                     0.11999
                                                         11.928 < 2e-16 ***
MaritalStatusNever-married
                                     0.85325
                                                0.07153
                                                         1.903 0.057100 .
MaritalStatusSeparated
                                     0.27591
                                                0.14502
MaritalStatusWidowed
                                    -0.12532
                                                0.13260 -0.945 0.344593
OccupationAdm-clerical
                                                          1.116 0.264401
                                     0.09969
                                                0.08932
OccupationArmed-Forces
                                     1.17453
                                                1.26734
                                                          0.927 0.354048
                                                         -0.875 0.381822
OccupationCraft-repair
                                    -0.06954
                                                0.07951
                                                0.08113 -11.086 < 2e-16 ***
OccupationExec-managerial
                                    -0.89943
OccupationFarming-fishing
                                                          5.179 2.23e-07 ***
                                     0.67258
                                                0.12987
                                                          6.180 6.42e-10 ***
OccupationHandlers-cleaners
                                     0.84740
                                                0.13713
                                                          3.794 0.000148 ***
OccupationMachine-op-inspct
                                     0.37896
                                                0.09988
                                                                < 2e-16 ***
OccupationOther-service
                                                          8.915
                                     1.02791
                                                0.11530
OccupationPriv-house-serv
                                     2.45531
                                                1.01952
                                                          2.408 0.016027 *
OccupationProf-specialty
                                    -0.51055
                                                0.08648
                                                         -5.904 3.55e-09 ***
                                                         -4.811 1.51e-06 ***
OccupationProtective-serv
                                    -0.59115
                                                0.12289
                                                         -4.031 5.54e-05 ***
OccupationSales
                                    -0.33671
                                                0.08352
                                                         -4.901 9.51e-07 ***
OccupationTech-support
                                    -0.54547
                                                0.11129
OccupationTransport-moving
                                          NA
                                                     NA
                                                             NA
                                                                       NA
```

Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

(Dispersion parameter for binomial family taken to be 1)

Null deviance: 35948 on 32560 degrees of freedom Residual deviance: 23861 on 32518 degrees of freedom

AIC: 23947

Number of Fisher Scoring iterations: 13