Multivariate Linear Regression

I am examining the number of nicotine dependence symptoms (response variable) as a function of smoking quantity, major depression, gender, and ethnicity.

```
Usage:
 my. Im <- lm(QuantitativeResponse ~ Explanatory1 + Explanatory2 + ..., data =
       my.subset)
 summary(my.lm)
 > NDcount.lm <- lm(ND.symp.count ~ SmkQuant + MAJORDEPLIFE + SEX + ETHRACE2A,</pre>
 + data=nesarc.subset)
 > summary(NDcount.lm)
 call:
 lm(formula = ND.symp.count ~ SmkQuant + MAJORDEPLIFE + SEX +
     ETHRACE2A, data = nesarc.subset)
 Residuals:
                                                     The coefficient is listed here, and can be used to
                10
     Min
                    Median
                                  30
                                           Max
                                                     interpret the direction (+/-) and strength
 -14.693
           -2.619
                    -0.640
                               2.109
                                       12.693
                                                     (magnitude) of each explanatory variable.
 Coefficients:
                 Estimate Std. Error t value Pr(>|t|)
                                                    <2e-16 ***
                                                                            SmkQuant is significantly (p<2e-
 (Intercept)
                  3.00532
                               0.21156
                                         14.205
                                                            ***
 SmkQuant
                                                    <2e-16
                                                                            16) and positively (+ coefficient)
                  3.04502
                                                    <2e-16 ***
                               0.21830
 MAJORDEPLIFE1
                                         13.949
                                                                            associated with ND.symp.count.
                                          -0.571
                 -0.10783
                               0.18899
                                                    0.5684
 SEX2
                                                                            Since SmkQuant is quantitative,
                                           0.407
 ETHRACE2A2
                  0.11651
                               0.28636
                                                    0.6842
                                                                            the coefficient of 0.15 means
                                           0.473
 ETHRACE2A3
                  0.28959
                               0.61273
                                                    0.6365
                  1.43270
                                                    0.0049 **
                                                                            that every additional cigarette
 ETHRACE2A4
                               0.50853
                                           2.817
 ETHRACE2A5
                                                                            smoked (one-unit increase in
                                                                            SmkQuant) is associated with a
 Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
                                                                            0.15 increase in the number of
                                                                            ND symptoms.
 Residual standard error: 3.746 on 1630 degrees of freedom
   (4200 observations deleted due to missingness)
 Multiple R-squared: 0.2194, Adjusted R-squared:
 F-statistic: 65.46 on 7 and 1630 DF, p-value: < 2.2e-16
ETHRACE2A is a categorical variable, and the
                                                          The adjusted R<sup>2</sup> means that the
"5" after the variable name means that this line
                                                          combination of smoking quantity,
of the table refers to ethnicity group 5
```

ETHRACE2A is a categorical variable, and the "5" after the variable name means that this line of the table refers to ethnicity group 5 compared to the reference group 1 (the lowest level, and the one missing from this table). There is a significant (p=.0203) and negative (coefficient) difference in the number of nicotine dependence symptoms for group 5 relative to group 1. The coefficient of -0.56 means that Hispanics (ethnic group 5) on average experiences 0.56 fewer nicotine dependence symptoms compared to Whites (group 1.)

The adjusted R² means that the combination of smoking quantity, major depression, gender, and ethnicity explains 21.61% of the variance in the number of nicotine dependence symptoms.

Multivariate Logistic Regression

I am examining the presence/absence of a nicotine dependence diagnosis (response variable) as a function of smoking quantity, major depression, gender, and ethnicity.

```
my.glm <- glm(QuantitativeResponse ~ Explanatory1 + Explanatory2 + ..., data
        = my.subset, family="binomial")
 summary(my.glm)
exp(my.glm$coefficients)
                                     # For odds ratios
                                     # For 95% confidence intervals of odds ratios
 exp(confint(my.glm))
 > ND.glm <- glm(TAB12MDX ~ SmkQuant + MAJORDEPLIFE + SEX + ETHRACE2A,</pre>
                    data=nesarc.subset, family="binomial")
 > summary(ND.glm)
 call:
glm(formula = TAB12MDX ~ SmkQuant + MAJORDEPLIFE + SEX + ETHRACE2A,
    family = "binomial", data = nesarc.subset)
                                                       The coefficient is listed here, and can only be used
 Deviance Residuals:
                                                       to interpret the direction (+/-). The coefficients
                       Median
                                       3Q
     Min
                 1Q
                                                 Max
           -1.0087
 -2.7073
                      -0.7156
                                  1.0716
                                             1.7547
                                                        need to be converted to odds ratios before the
                                                       strength of the relationship can be interpreted.
 Coefficients:
                  Estimate Std. Error z value Pr(>|z|)
                  -1.064749
 (Intercept)
                                0.119024
                                            -8.946
                                                      < 2e-16
                                                     < 2e-16 ***
                                            10.144
                   0.066474
                                0.006553
 SmkQuant
                                                                             Look first at the p-value for
                  0.909948
                                                    7.47e-16 ***
 MAJORDEPLIFE1
                                0.112860
                                             8.063
                                                                             to see whether each term is
 SEX2
                  -0.010700
                                0.099188
                                            -0.108
                                                       0.9141
 ETHRACE2A2
                   0.088517
                                                       0.5593
                                0.151606
                                             0.584
                                                                             significant before going on
                                             0.701
 ETHRACE2A3
                   0.220670
                                0.314691
                                                       0.4832
                                                                             to odds ratios. No need to
                                             1.751
 ETHRACE2A4
                   0.469801
                                0.268380
                                                       0.0800
                                                       0.0221 *
                                                                             discuss odds ratios if the p-
 ETHRACE2A5
                 -0.299834
                                0.130988
                                            -2.289
                                                                             value doesn't show a
 Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ''
                                                                             significant relationship
 (Dispersion parameter for binomial family taken to be 1)
     Null deviance: 2646.6
                                 on 1913
                                            degrees of freedom
                                            degrees of freedom
 Residual deviance: 2427.7
                                 on 1906
   (3924 observations deleted due to missingness)
 AIC: 2443.7
                                                    These are the odds ratios, which are obtained by
 Number of Fisher Scoring iterations: 4
                                                    exponentiating the coefficients from the above
                                                    table. Odds ratios are easier to interpet
 > exp(ND.glm$coefficients)
   (Intercept)
                       SmkQuant MAJORDEPLIFE1
                                                              SEX2
                                                                       ETHRACE2A2
 ETHRACE2A3
                                                        0.9893570
     0.3448143
                      1.0687334
                                       2.4841938
                                                                         1.0925531
 1.2469122
    ETHRACE2A4
                     ETHRACE2A5
     1.5996764
                      0.7409412
                                                          Since the above table showed that
                                                          smoking quantity is significantly
                                                          associated with an increase in the odds of
Since this is a categorical variable, first figure
                                                          having nicotine dependence, this odds
out which level it's referring to, and what the
                                                          ratio means that for every additional
reference group is (which is always missing
                                                          cigarette smoked (a 1-unit increase in this
from the results). This odds ratio refers to
                                                          quantitative variable), one's odds of
ethnic group 5 relative to group 1 (the
                                                          nicotine dependence are 1.07 times
reference group). This indicates that Hispanics
                                                          greater. In other words, the odds of
(group 5) are only 74% as likely as Whites
                                                          nicotine dependence increase by 7% with
(group 1) to have nicotine dependence.
                                                          every additional cigarette smoked.
```

> exp(confint(ND.glm)) Waiting for profiling to be done... 2.5 % 97.5 % (Intercept) 0.2724703 0.4345419 SmkQuant 1.0552795 1.0827431 MAJORDEPLIFE1 1.9934072 3.1032123 SEX2 0.8144679 1.2016454 ETHRACE2A2 0.8110362 1.4701558 ETHRACE2A3 0.6752027 2.3345977 ETHRACE2A4 0.9454660 2.7183982 ETHRACE2A5 0.5724646 0.9569247

The odds ratio for Hispanics (group 5) vs. Whites (reference group) among your sample is 0.74, but the true population odds ratio falls somewhere between 0.57 and 0.96.

These are the 95% confidence intervals for the odds ratios. That is, when you're making inferences about the larger (unobserved) population, they give the range that is likely to contain the true population odds ratio.

Even though the odds ratio for **your sample** is 1.07, the true population odds ratio might be slightly different, due to random variation in sampling. The odds ratio indicates that there's a 95% certainty that the **true population odds ratio** falls somewhere between 1.055 and 1.082.