# I ntegrated Data to Predict Chronic Absence in the Clairton City Public School District 

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This report addresses chronic absence in Clairton City Public School District and its association with student demographic variables, within-year move, Human Service variables, census tract variables, and house assessment data. Student files from the year of 2013 were combined with student records from DHS. The census tract data and housing information were integrated with student level data. Only students with total number of enrollment dates greater than 50 were included, resulting with 738 students. Census tract variables were missing for six students, who were excluded in the analysis. The final analysis sample has 732 students.

Attendance rate was computed by summing excused and unexcused absences divided by enrollment days (i.e., (iExc + iUnexc)/iMemb).

- Dependent variables:
- chronic absence - was created (No, < 10\%; yes, $\geq 10 \%$ ).
- Predictors of CART:
- School data:
- $\operatorname{sex}(0=m a l e, 1=f e m a l e)$,
- Within school year move (defined as whether the student had a start date after 09/30)
- Old for grade
- Department of Human Service Data (all the following variables are binary; 1=yes, 0=no)
- CYF (EVER IN Children, Youth, and Families Children)
- DA (EVER IN Drug \& Alcohol - CCBHO and County)
- EI (EVER IN Early Intervention)
- FSC (EVER IN Family Support Center)
- HH (EVER IN Hunger and Homeless)
- MH (EVER IN Mental Health - CCBHO and County)
- MR (EVER IN Office of Mental Retardation and Developmental Disabilities)
- HACP (EVER IN Housing Authority of City of Pittsburgh)
- DPW (EVER IN Department of Public Welfare-FS, SSI, and TNF)
- JPO (Ever in JPO children): this is excluded for grades k-5.
- Census Tract data
- Median House Sale price of 2013
- Percentage below poverty level
- Percentage Black
- sumoftotal (sum of total delinquency)
- HsgAgeBefore1914_tract_CountOfma (number of parcels-structure built before 1914)
- Tract ranking suburbs
- RankSuburbs_Poverty_12
- RankSuburbs_Poverty200_12
- RankSuburbs_FHF_12
- RankSuburbs_MaleLF_12
- RankSuburbs_Vacant_12
- RankSuburbs_NoVehicle_12
- RankSuburbs_Dropout_12
- RankSuburbs_Sum
- House assessment data
- Homestead status
- Three different types of analyses were performed for each grade:
- Section 1: Bivariate relationship between chronic absence and other variables were examined using t-test (for continuous variables) and two-way chi-square (for dichotomous variables).
- Section 2: Binary logistic regression was performed predicting chronic absence by the aforementioned predictors.
- Section 3: Classification and tree analysis (CART) is a data mining method to determine important predictors of categorical dependent variable using a non-parametric iterative process. Unlike logistic regression, CART examines interactions among predictors. CART was performed for the outcome variable Chronic Absence for subjects by each grade.
- There is no missing data on these variables.


## 1. Bivariate relationship

### 1.1 Description of house parcel and census tract variables

There are 422 house parcels and $28.91 \%$ is homestead. There are 3 census tracts from which Clairton students were from.

Table 1 presents the specific values of census tract variables for the three tracts respectively.
Table 1. Census tract variables measured at tract level

| TRACT | 492700 | 492800 | 492900 |
| :--- | ---: | ---: | ---: |
| SumOfTotal | 37511.35 | 69942.66 | 22356.79 |
| HsgAgeBefore1914_tract_CountOfma | 183 | 149 | 10 |
| Tract2013_MEDIAN_of_SalePrice | 16500 | 16500 | 13500 |
| percent_poverty | 25.4 | 36.4 | 23.1 |
| percent_black | 0.09 | 0.11 | 0.06 |
| RankSuburbs_Poverty_12 | 241 | 255 | 247 |
| RankSuburbs_Poverty200_12 | 237 | 250 | 228 |
| RankSuburbs_FHF_12 | 258 | 229 | 231 |
| RankSuburbs_MaleLF_12 | 211 | 259 | 223 |
| RankSuburbs_Vacant_12 | 241 | 251 | 229 |
| RankSuburbs_NoVehicle_12 | 196 | 257 | 223 |
| RankSuburbs_Dropout_12 | 1 | 263 | 1 |
| RankSuburbs_Sum | 1385 | 1764 | 1382 |

### 1.2 Description of student-level variables by chronic absence

Due to small sample size, students were categorized into three grade groups, K-5, 6-8, and 9-12. For each grade group, bivariate relationship between chronic absence and other variables were examined using t-test (for continuous variables) and two-way chi-square (for dichotomous variables). Effect sizes (Point-Biserial correlation for continuous variables and Cramer's V for dichotomous variables) was examined in order to determine meaningfulness of results. Cramer's $V$ and point-biserial correlation are on the same metric as correlation coefficient (small, 10-.30; medium, .30-.50; large, >.50).

Table 2. Bivariate association between attendance group and predictors—Kindergarten to Grade 5 ( $\mathrm{N}=391$ )

|  | Non-Chronic absent 72.40\% |  | Chronic absent 27.60\% |  | Correlation |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Proportion |  | Proportion |  |  |
| Female | 0.51 |  | 0.49 |  | . 013 |
| old for grade | 0.07 |  | 0.11 |  | . 059 |
| School Move | 0.03 |  | 0.16 |  | .225*** |
| CYF | 0.25 |  | 0.40 |  | .145** |
| DA | 0.00 |  | 0.00 |  | . 03 |
| MH | 0.18 |  | 0.19 |  | . 021 |
| El | 0.10 |  | 0.05 |  | . 085 |
| FSC | 0.19 |  | 0.16 |  | . 043 |
| HH | 0.13 |  | 0.11 |  | . 027 |
| MR | 0.00 |  | 0.00 |  | . 031 |
| JPO | 0.00 |  | 0.00 |  | na |
| DPW | 0.36 |  | 0.40 |  | . 035 |
| HACP | 0.02 |  | 0.00 |  | . 077 |
| homestead | 0.25 |  | 0.19 |  | . 059 |
|  | M | SD | M | SD |  |
| Sum of Total Delinquency in 2013 | 48964.83 | 21708.83 | 45052.36 | 20459.72 | 0.082 |
| Number of parcels-structure built before |  |  |  |  |  |
| 1914 | 110.92 | 70.15 | 115.63 | 73.29 | 0.03 |
| Medium house sales price in 2013 | 15545.94 | 1399.60 | 15555.56 | 1399.82 | 0.003 |
| \% below poverty level | 30.19 | 6.29 | 28.85 | 6.00 | 0.096 |
| \% black | 0.09 | 0.02 | 0.09 | 0.02 | 0.033 |
| Tract ranking Poverty | 249.93 | 5.49 | 248.20 | 5.85 | 0.137** |
| Tract ranking Poverty200 | 240.66 | 9.87 | 239.10 | 9.28 | 0.072 |
| Tract ranking FHF | 234.86 | 10.90 | 238.49 | 13.03 | 0.14** |
| Tract ranking MaleLF | 238.90 | 20.61 | 233.00 | 20.98 | 0.127* |
| Tract ranking Vacant | 242.20 | 9.74 | 241.02 | 9.17 | 0.055 |
| Tract ranking NoVehicle | 235.19 | 23.76 | 227.66 | 25.41 | 0.138* |
| Tract ranking Dropout_12 | 132.46 | 131.23 | 100.46 | 127.74 | 0.109* |
| RankSuburbs_Sum | 1574.22 | 190.80 | 1527.94 | 185.53 | 0.109* |

Table 3. Bivariate association between attendance group and predictors-Grade 6-8 ( $\mathrm{N}=160$ )

|  | Non-Chronic absent 73.10\% |  | Chronic absent 26.90\% |  | Correlation |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Proportion |  | Proportion |  |  |
| Female | 0.48 |  | 0.33 |  | . 137 |
| old for grade | 0.12 |  | 0.30 |  | .216** |
| School Move | 0.05 |  | 0.07 |  | . 036 |
| CYF | 0.28 |  | 0.60 |  | .296*** |
| DA | 0.00 |  | 0.00 |  | na |
| MH | 0.28 |  | 0.35 |  | . 065 |
| El | 0.09 |  | 0.07 |  | . 038 |
| FSC | 0.22 |  | 0.14 |  | . 092 |
| HH | 0.03 |  | 0.07 |  | . 077 |
| MR | 0.02 |  | 0.02 |  | . 020 |
| JPO | 0.01 |  | 0.02 |  | . 059 |
| DPW | 0.39 |  | 0.42 |  | . 023 |
| HACP | 0.02 |  | 0.02 |  | . 020 |
| homestead | 0.28 |  | 0.19 |  | . 097 |
|  | M | SD | M | SD |  |
| Sum of Total Delinquency in 2013 | 49054.99 | 21465.89 | 39513.32 | 20143.74 | 0.198* |
| Number of parcels-structure built before |  |  |  |  |  |
| 1914 | 114.39 | 69.72 | 93.05 | 79.36 | 0.13 |
| Medium house sales price in 2013 | 15602.56 | 1379.56 | 15104.65 | 1514.05 | 0.155* |
| \% below poverty level | 30.16 | 6.26 | 27.40 | 5.74 | 0.197* |
| \% black | 0.09 | 0.02 | 0.08 | 0.02 | 0.18* |
| Tract ranking Poverty | 249.74 | 5.65 | 247.70 | 5.22 | 0.162* |
| Tract ranking Poverty200 | 240.75 | 9.73 | 236.44 | 9.30 | 0.196* |
| Tract ranking FHF | 235.55 | 11.49 | 237.35 | 12.28 | 0.069 |
| Tract ranking MaleLF | 238.39 | 20.95 | 229.98 | 18.93 | 0.181* |
| Tract ranking Vacant | 242.37 | 9.57 | 238.21 | 9.44 | 0.191* |
| Tract ranking NoVehicle | 234.32 | 24.49 | 225.58 | 22.68 | 0.16* |
| Tract ranking Dropout_12 | 130.88 | 131.56 | 74.12 | 118.91 | 0.194* |
| RankSuburbs_Sum | 1571.98 | 191.20 | 1489.37 | 172.89 | 0.194* |

Table 4. Bivariate association between attendance group and predictors-Grade 9-12 (N=181)

|  | Non-Chronic absent 60.20\% |  | Chronic absent 39.80\% |  | Correlation |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Proportion |  | Proportion |  |  |
| Female | 0.46 |  | 0.56 |  | . 095 |
| old for grade | 0.06 |  | 0.36 |  | .393*** |
| School Move | 0.01 |  | 0.11 |  | .230** |
| CYF | 0.30 |  | 0.49 |  | .185* |
| DA | 0.00 |  | 0.06 |  | .185* |
| MH | 0.21 |  | 0.33 |  | . 137 |
| El | 0.01 |  | 0.06 |  | . 139 |
| FSC | 0.13 |  | 0.13 |  | . 005 |
| HH | 0.08 |  | 0.21 |  | .182* |
| MR | 0.04 |  | 0.01 |  | . 068 |
| JPO | 0.03 |  | 0.14 |  | .211** |
| DPW | 0.32 |  | 0.53 |  | .206** |
| HACP | 0.02 |  | 0.01 |  | . 017 |
| homestead | 0.33 |  | 0.22 |  | . 117 |
|  | M | SD | M | SD |  |
| Sum of Total Delinquency in 2013 | 49546.29 | 21009.10 | 43388.17 | 43388.17 | 0.14 |
| Number of parcels-structure built before |  |  |  |  |  |
| 1914 | 120.13 | 68.01 | 92.89 | 92.89 | 0.185* |
| Medium house sales price in 2013 | 15701.83 | 1331.80 | 15166.67 | 15166.67 | 0.185* |
| \% below poverty level | 30.24 | 6.19 | 28.66 | 28.66 | 0.124 |
| \% black | 0.09 | 0.02 | 0.08 | 0.08 | 0.174* |
| Tract ranking Poverty | 249.53 | 5.85 | 249.11 | 249.11 | 0.037 |
| Tract ranking Poverty200 | 241.05 | 9.47 | 238.06 | 238.06 | 0.15* |
| Tract ranking FHF | 236.45 | 12.15 | 234.72 | 234.72 | 0.074 |
| Tract ranking MaleLF | 237.97 | 21.36 | 235.00 | 235.00 | 0.07 |
| Tract ranking Vacant | 242.76 | 9.25 | 239.56 | 239.56 | 0.162* |
| Tract ranking NoVehicle | 233.40 | 25.38 | 231.72 | 231.72 | 0.034 |
| Tract ranking Dropout_12 | 130.80 | 131.60 | 102.89 | 102.89 | 0.105 |
| RankSuburbs_Sum | 1571.96 | 191.16 | 1531.06 | 1531.06 | 0.106 |

Figure 1. Effect sizes of demographic variables by grades


Figure 2. Effect sizes of DHS involvement variables by grades


Among tract ranking variables, the sum track ranking presents similar bivariate relationship as the other tract ranking variables, and thus was selected as a census tract variable and presented in Figure 3.

Figure 3. Effect sizes of house and census tract variables by grades


## 2. Logistic Regression

Logistic regression was used to predict chronic absence for each grade group. As there are only three census tracts, all census tract variables cannot be included as predictors. Instead, census tract is used as a categorical predictor represented by two indicator-coded variables (Indicator 1 compares tract 492700 to 492900 and indicator 2 compares tract 492800 to 492900 ). The three census tracts differ in their chronic absence rate for each grade group ( $p=.016$, Cramer's $v=.145$ for grades $k-5 ; p=.044$, Cramer's $\mathrm{v}=.198$ for grades $6-8 ; p=.044$, Cramer's $\mathrm{v}=.186$ for grades $9-12$ ).

Table 5 presents the chronic absence rate for each tract of three grade groups respectively.

Table 5. Cross-tabulation of census tracts by chronic absence

|  |  |  |  | chronic |  | Total |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Grade K-5 | TRACTCE10 | 492700 |  | 0 | 1 |  |
|  |  |  | Count | 51 | 33 | 84 |
|  |  |  | \% within TRACTCE10 | 60.70\% | 39.30\% | 100.00\% |
|  |  | 492800 | Count | 142 | 41 | 183 |
|  |  |  | \% within TRACTCE10 | 77.60\% | 22.40\% | 100.00\% |
|  |  | 492900 | Count | 90 | 34 | 124 |
|  | Total |  | \% within TRACTCE10 | 72.60\% | 27.40\% | 100.00\% |
|  |  |  | Count | 283 | 108 | 391 |
|  |  |  | \% within TRACTCE10 | 72.40\% | 27.60\% | 100.00\% |
| Grade 6-8 | TRACTCE10 | 492700 | Count | 24 | 11 | 35 |
|  |  |  | \% within TRACTCE10 | 68.60\% | 31.40\% | 100.00\% |
|  |  | 492800 | Count | 58 | 12 | 70 |
|  |  |  | \% within TRACTCE10 | 82.90\% | 17.10\% | 100.00\% |
|  |  | 492900 | Count | 35 | 20 | 55 |
|  |  |  | \% within TRACTCE10 | 63.60\% | 36.40\% | 100.00\% |
|  | Total |  | Count | 117 | 43 | 160 |
|  |  |  | \% within TRACTCE10 | 73.10\% | 26.90\% | 100.00\% |
| Grade 9- |  |  |  |  |  |  |
| 12 | TRACTCE10 | 492700 | Count | 26 | 12 | 38 |
|  |  |  | \% within TRACTCE10 | 68.40\% | 31.60\% | 100.00\% |
|  |  | 492800 | Count | 54 | 28 | 82 |
|  |  |  | \% within TRACTCE10 | 65.90\% | 34.10\% | 100.00\% |
|  |  | 492900 | Count | 29 | 32 | 61 |
|  |  |  | \% within TRACTCE10 | 47.50\% | 52.50\% | 100.00\% |
|  | Total |  | Count | 109 | 72 | 181 |
|  |  |  | \% within TRACTCE10 | 60.20\% | 39.80\% | 100.00\% |

Table 6 presents odds ratio and statistical significance for grades k-5, 6-8, and 9-12.

Table 6. Odds ratio of logistic regression predicting chronic absence for $k$ to $5^{\text {th }} \operatorname{grade}(* p<.05, * * p<.01, * * * p<.001$ )

|  | Grade K-5 |  | Grade 6-8 | Grade 9-12 |
| :---: | :---: | :---: | :---: | :---: |
| Female | 0.796 |  | 0.438 | 1.293 |
| old for grade | 1.070 |  | 3.089 * | $10.086^{* * *}$ |
| School Move | 5.973 | *** | 1.116 | 16.969 * |
| CYF | 2.120 | ** | 4.483 *** | 0.96 |
| DA | 0.000 |  | na | 5E+16 |
| MH | 1.056 |  | 1.002 | 1.031 |
| El | 0.469 |  | 0.355 | 2.736 |
| FSC | 0.702 |  | 0.373 | 1.634 |
| HH | 0.904 |  | 2.4 | 2.38 |
| MR | 0.000 |  | 2.628 | 0 |
| JPO | na |  | 2.582 | 7.16 * |
| DPW | 1.055 |  | 0.499 | 2.261 |
| HACP | 0.000 |  | 6.57 | 0.057 |
| homestead | 0.656 |  | 0.468 | 0.857 |
| Tract | Wald $\chi^{2}=6.402$ | * | Wald $\chi^{2}=3.504$ | Wald $\chi^{2}=3.571$ |
| 492700 vs 492900 | 1.952 | * | 1.05 | 0.445 |
| 492800 vs 492900 | 0.941 |  | 0.438 | 0.47 |
| Pseudo R ${ }^{2}$ | 0.155 |  | 0.28 | 0.43 |

## 3. Classification and Regression Tree Analysis 3.1 Grade K-5

- $N=391$
- 4 predictors contributed to the classification of chronic absence. CART produced 6 child nodes.
- The predictors are: level-1, school move; level-2, tract; level-3, CYF; level-4, Tract.
- Node 2 had the highest levels of chronic absence ( $65.4 \%$ ) which contained $6.6 \%$ of students who moved.
- Node 9 had the lowest level of chronic absence ( $14.2 \%$ ) which contained $27.1 \%$ of students who were did not move, lived in tract 482800, were not in CYF, and non-homestead.
- Overall $74.4 \%$ of students were correctly classified.

Table 7. Importance table (Kindergarten-Grade 5)

| Independent Variable | Normalized <br> Importance |
| :--- | ---: | ---: |
| Importance |  |

Table 8. Chronic absence by node (kindergarten-Grade 5).

| Move | Tract | CYF | Homestead | Node | N |  | \% |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  | \% Total Sample | Chronic absence |
| Y |  |  |  | 2 | 26 | 6.60\% | 65.40\% |
| N | 492700 |  |  | 3 | 77 | 19.70\% | 36.40\% |
| N | 492800;492900 | Y |  | 6 | 84 | 21.50\% | 29.80\% |
| N | 492900 | N |  | 8 | 72 | 18.40\% | 22.20\% |
| N | 482800 | $N$ | N | 9 | 106 | 27.10\% | 14.20\% |
| N | 482800 | N | Y | 10 | 26 | 6.60\% | 26.90\% |

Figure 4. Chronic absence by node (kindergarten-Grade 5).


Figure 5. Tree Diagram (kindergarten-Grade 5).


### 3.2 Grade 6-8

- $\mathrm{N}=160$
- 2 predictors contributed to the classification of chronic absence. CART produced 3 child nodes.
- The predictors are: level-1, CYF; level-2, tract.
- Node 1 had the highest levels of chronic absence (44.1\%). Node 1 contained $36.9 \%$ of students who were in CYF.
- Node 4 had the lowest level of chronic absence (10.7\%) which contained $46.9 \%$ of students who were not in CYF, and lived in tract 492700 and 492800.
- Overall $73.1 \%$ of students were correctly classified.

Table 9. Importance table (Grade 6-8)

|  | Normalized <br> Independent Variable | Importance |
| :--- | ---: | ---: |
| Importance |  |  |

Table 10. Chronic absence by node (Grade 6-8).


Figure 6. Chronic absence by node (Grade 6-8).


Figure 7. Tree Diagram (Grade 6-8).


### 3.3 Grade 9-12

- $\mathrm{N}=181$
- Only 1 predictor, Old for Grade, is significant, resulting in two nodes.
- Overall $71.3 \%$ of students were correctly classified.

Table 11. Importance table (Grade 9-12)

| Independent Variable | Importance | Normalized <br> Importance |
| :--- | ---: | ---: |
| old for grade | 0.074 | $100.00 \%$ |

Table 12. Chronic absence by node (Grade 9-12).

| Old for grade | Node | N |  | \% Total Sample |
| :--- | ---: | ---: | ---: | ---: |
| \% Chronic absence |  |  |  |  |
| Y | 1 | 149 | $82.30 \%$ | $30.90 \%$ |

Figure 8. Chronic absence by node (Grade 9-12).


Figure 9. Tree Diagram (Grade 9-12).


