Missing Analysis

Dominik Glandorf

2022-11-22

Background variables

The spreadsheet knows 161 variables. The corresponding file contains 176 columns. The expected variables freshman, transfer are not in the dataset. Therefore exist variables pascd, hscd, must_hsid, ncessch, hs_address, hs_city, hs_state

Requested and available variables

```
[1] Variable: mellon_id, type: numeric
[1] Values (46408 unique): 300890, 189970, 314750, 173027, 195012, ...
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: student_sid, type: numeric
[1] Values (46408 unique): 10857406, 10859561, 10861911, 10861952, 10865378, ...
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: group_a, type: character
[1] Values (2 unique): no, yes
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: mellon_enr_dt_a, type: character
[1] Values (1 unique): NA
[1] Missing: 100%
[1] should not be used as a predictor
[1] Variable: group_b, type: character
[1] Values (1 unique): no
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: mellon_enr_dt_b, type: character
[1] Values (1 unique): NA
[1] Missing: 100%
[1] should not be used as a predictor
[1] Variable: mellon_yr, type: numeric
[1] Values (1 unique): NA
[1] Missing: 100%
```

```
[1] should not be used as a predictor
[1]
[1] Variable: birth_year, type: numeric
[1] Values (17 unique): 1990, 1991, 1989, 1992, 1997, ...
[1] Missing: 0%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: birth_month, type: numeric
[1] Values (12 unique): 5, 4, 7, 2, 10, ...
[1] Missing: 0%
[1] is used in feature engineering and hence not included
[1] Variable: gender, type: character
[1] Values (5 unique): F, M, NA, X, U
[1] Missing: 0.1%
[1] _____
[1] Variable: female, type: character
[1] Values (3 unique): yes, no, NA
[1] Missing: 0.3%
[1]
[1] Variable: int_student, type: numeric
[1] Values (3 unique): 0, 1, NA
[1] Missing: 18.6%
[1] Variable: ethnicity, type: character
[1] Values (7 unique): Asian / Asian American, White non-Hispanic, Hispanic, NA, Black, ...
[1] Missing: 3%
[1] Variable: ethnicity_detail, type: character
[1] Values (15 unique): Filipino/Filipino American, White/Caucasian, Thai/Other Asian, Chicano/Mexican-
[1] Missing: 2.7%
[1]
[1] Variable: asian, type: character
[1] Values (3 unique): yes, no, NA
[1] Missing: 2.7%
[1]
[1] Variable: hispanic, type: character
[1] Values (3 unique): no, yes, NA
[1] Missing: 2.7%
[1]
[1] Variable: black, type: character
[1] Values (3 unique): no, NA, yes
[1] Missing: 2.7%
[1] _____
[1] Variable: white, type: character
[1] Values (3 unique): no, yes, NA
[1] Missing: 2.7%
[1]
[1] Variable: urm, type: numeric
[1] Values (3 unique): 0, 1, NA
[1] Missing: 3%
[1] ______
[1] Variable: citizenship_app, type: character
[1] Values (5 unique): US Citizen in Transit, Not US Citizen, Permanent Resident, NA, US Citizen
```

```
[1] Missing: 0.6%
[1] _____
[1] Variable: first_generation, type: numeric
[1] Values (3 unique): 0, 1, NA
[1] Missing: 1.3%
[1] _____
[1] Variable: low_income, type: character
[1] Values (3 unique): no, yes, NA
[1] Missing: 0.1%
[1] _____
[1] Variable: low_income_desc, type: character
[1] Values (3 unique): Not low income / Not stated, Low income, Not stated
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: father_edu_level_code, type: numeric
[1] Values (9 unique): 7, 8, 5, NA, 3, ...
[1] Missing: 13.9%
[1] Variable: father_edu_level_desc, type: character
[1] Values (9 unique): 4 year college grad, Postgraduate study, Some college, NA, High school graduate,
[1] Missing: 23.9%
[1] should not be used as a predictor
[1] Variable: mother_edu_level_code, type: numeric
[1] Values (8 unique): 7, 8, 3, 1, 2, ...
[1] Missing: 10.7%
[1] Variable: mother_edu_level_desc, type: character
[1] Values (8 unique): 4 year college grad, Postgraduate study, High school graduate, No high school, S
[1] Missing: 20.8%
[1] should not be used as a predictor
[1] Variable: first_language, type: character
[1] Values (4 unique): English only, English/non-English, Non-English, NA
[1] Missing: 75%
[1] Variable: ell, type: numeric
[1] Values (2 unique): 0, 1
[1] Missing: 0%
[1] Variable: foster_care, type: integer
[1] Values (3 unique): 0, 1, NA
[1] Missing: 27.9%
[1]
[1] Variable: single_parent, type: numeric
[1] Values (3 unique): NA, 0, 1
[1] Missing: 28.1%
[1] Variable: raised_by_single_parent, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
```

[1] Variable: household size app, type: numeric

```
[1] Values (15 unique): NA, 4, 6, 7, 5, ...
[1] Missing: 42.3%
[1] Variable: city_residence_app, type: character
[1] Values (2969 unique): NA, POMONA, ELK GROVE, WESTMINSTER, LOS ANGELES, ...
[1] Missing: 0.1%
[1]
[1] Variable: state_residence_app, type: character
[1] Values (57 unique): NA, CA, CO, AZ, DE, ...
[1] Missing: 8.3%
[1]
[1] Variable: country_residence_app, type: character
[1] Values (9 unique): NA, USA, China, South Korea, Taiwan, ...
[1] Missing: 6.8%
[1]
[1] Variable: zip_code_app, type: character
[1] Values (6525 unique): NA, 91767, 95757, 92683, 90022, ...
[1] Missing: 0.1%
[1] Variable: distance from home, type: numeric
[1] Values (721 unique): NA, 6302, 6670, 6567, 6604, ...
[1] Missing: 27.9%
[1]
[1] Variable: geo_category, type: character
[1] Values (5 unique): Other CA, Non-OC Southern CA, Orange County, Out of State US, Foreign Student
[1] Missing: 0%
[1]
[1] Variable: application_term_code, type: numeric
[1] Values (10 unique): 200892, 200992, 201092, 201592, 201692, ...
[1] Missing: 0%
[1]
[1] Variable: application_term_desc, type: character
[1] Values (10 unique): Fall 2008, Fall 2009, Fall 2010, Fall 2015, Fall 2016, ...
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: application_status, type: character
[1] Values (1 unique): Freshmen
[1] Missing: 0%
[1] _____
[1] Variable: admitdate, type: character
[1] Values (9 unique): F08, F09, F10, F15, F16, ...
[1] Missing: 0%
[1]
[1] Variable: sport_at_admission, type: character
[1] Values (10 unique): NA, SP, PH, H, UH, ...
[1] Missing: 55.7%
[1]
[1] Variable: cal_res_at_app, type: character
[1] Values (4 unique): NA, Bona-Fide Resident, California Resident, Non-California Resident
[1] Missing: 28%
[1]
[1] Variable: entry_units_completed_transfer, type: numeric
[1] Values (370 unique): NA, 0, 24, 32, 12, ...
```

```
[1] Missing: 28%
[1] _____
[1] Variable: hs_name, type: character
[1] Values (4218 unique): NA, POMONA HS, FRANKLIN, LA QUINTA HS, J A GARFIELD HS, ...
[1] Missing: 28%
[1] _____
[1] Variable: hs_gpa, type: numeric
[1] Values (217 unique): NA, 3.45, 4.0300002, 3.9000001, 4, ...
[1] Missing: 28.1%
[1]
[1] Variable: sat_math_score, type: numeric
[1] Values (57 unique): NA, 530, 540, 590, 610, ...
[1] Missing: 19.6%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: sat_verb_score, type: numeric
[1] Values (55 unique): NA, 550, 590, 540, 430, ...
[1] Missing: 77.6%
[1] is used in feature engineering and hence not included
[1] Variable: sat_writing_score, type: numeric
[1] Values (60 unique): NA, 580, 560, 540, 520, ...
[1] Missing: 32.7%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: sat_total_score, type: numeric
[1] Values (154 unique): NA, 1660, 1690, 1670, 1680, ...
[1] Missing: 32.7%
[1] is used in feature engineering and hence not included
[1] _____
[1] Variable: toefl_score, type: numeric
[1] Values (76 unique): NA, 83, 100, 94, 93, ...
[1] Missing: 90.2%
[1] _____
[1] Variable: ielts_score, type: numeric
[1] Values (9 unique): NA, 7.5, 6.5, 6, 7, ...
[1] Missing: 99.7%
[1] _____
[1] Variable: transfer_gpa, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] Variable: act_english_score, type: numeric
[1] Values (33 unique): NA, 25, 24, 16, 21, ...
[1] Missing: 66.8%
[1] is used in feature engineering and hence not included
[1] _____
[1] Variable: act_math_score, type: numeric
[1] Values (27 unique): NA, 27, 26, 19, 30, ...
[1] Missing: 66.8%
[1] is used in feature engineering and hence not included
[1] Variable: act_reading_score, type: numeric
[1] Values (32 unique): NA, 25, 24, 19, 22, ...
```

```
[1] Missing: 66.8%
[1] is used in feature engineering and hence not included
[1] Variable: act_scireason_score, type: numeric
[1] Values (33 unique): NA, 23, 26, 25, 19, ...
[1] Missing: 66.8%
[1] is used in feature engineering and hence not included
[1] Variable: act_write_score, type: numeric
[1] Values (34 unique): NA, 25, 23, 19, 30, ...
[1] Missing: 67.1%
[1] is used in feature engineering and hence not included
[1] Variable: act_writesub_score, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: act_total_score, type: numeric
[1] Values (30 unique): NA, 25, 22, 20, 30, ...
[1] Missing: 66.8%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: best_subject_code_1, type: character
[1] Values (39 unique): NA, UH, 39, M2, 52, ...
[1] Missing: 61.9%
[1] _____
[1] Variable: best_subject_score_1, type: integer
[1] Values (46 unique): NA, 540, 610, 650, 720, ...
[1] Missing: 62%
[1]
[1] Variable: best_subject_code_2, type: character
[1] Values (37 unique): NA, M2, 52, EB, PH, ...
[1] Missing: 67.5%
[1] Variable: best_subject_score_2, type: integer
[1] Values (51 unique): NA, 590, 600, 730, 540, ...
[1] Missing: 67.6%
[1] ______
[1] Variable: best_subject_code_3, type: character
[1] Values (2 unique): NA, AH
[1] Missing: 100%
[1] ______
[1] Variable: best_subject_score_3, type: integer
[1] Values (2 unique): NA, 480
[1] Missing: 100%
[1] Variable: uc_read_score, type: numeric
[1] Values (80 unique): NA, 77, 79, 75, 71, ...
[1] Missing: 28.2%
[1]
[1] Variable: uc_math_score, type: numeric
[1] Values (72 unique): NA, 81, 74, 65, 72, ...
[1] Missing: 28.1%
```

```
[1] Variable: uc_writing_score, type: numeric
[1] Values (79 unique): NA, 77, 76, 73, 72, ...
[1] Missing: 28.2%
[1] _____
[1] Variable: uc_total_score, type: numeric
[1] Values (228 unique): NA, 232, 229, 228, 208, ...
[1] Missing: 28.1%
[1] _____
[1] Variable: comp_app_rev_score, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: sup_app_rev_score, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: ap_code_1, type: character
[1] Values (41 unique): NA, 25, 14, 20, 35, ...
[1] Missing: 79.7%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_1, type: numeric
[1] Values (6 unique): NA, 2, 5, 3, 4, ...
[1] Missing: 82.2%
[1] is used in feature engineering and hence not included
[1] ______
[1] Variable: ap_year_1, type: integer
[1] Values (9 unique): NA, 2015, 2016, 2014, 2013, ...
[1] Missing: 79.7%
[1] is used in feature engineering and hence not included
[1] _____
[1] Variable: ap_essay_flag_1, type: numeric
[1] Values (10 unique): NA, 0, 2, 1, 4, ...
[1] Missing: 98.3%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_2, type: character
[1] Values (41 unique): NA, 35, 07, 66, 90, ...
[1] Missing: 43.7%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_score_2, type: numeric
[1] Values (6 unique): NA, 1, 3, 4, 5, ...
[1] Missing: 48.5%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_2, type: integer
[1] Values (12 unique): NA, 2015, 2016, 2014, 2012, ...
[1] Missing: 53%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_2, type: numeric
[1] Values (11 unique): NA, 0, 1, 2, 3, ...
```

```
[1] Missing: 67.3%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_3, type: character
[1] Values (44 unique): NA, 37, 25, 36, 93, ...
[1] Missing: 48.4%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_score_3, type: numeric
[1] Values (6 unique): NA, 3, 2, 4, 5, ...
[1] Missing: 52.5%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_3, type: integer
[1] Values (13 unique): NA, 2015, 2014, 2013, 2016, ...
[1] Missing: 48.4%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_3, type: numeric
[1] Values (11 unique): NA, 0, 4, 1, 2, ...
[1] Missing: 70.2%
[1] is used in feature engineering and hence not included
[1] ______
[1] Variable: ap_code_4, type: character
[1] Values (42 unique): NA, 57, 93, 07, 40, ...
[1] Missing: 54.5%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_score_4, type: numeric
[1] Values (6 unique): NA, 1, 3, 4, 2, ...
[1] Missing: 57.6%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_4, type: integer
[1] Values (12 unique): NA, 2015, 2014, 2013, 2016, ...
[1] Missing: 54.5%
[1] is used in feature engineering and hence not included
[1] _____
[1] Variable: ap_essay_flag_4, type: numeric
[1] Values (11 unique): NA, 0, 1, 5, 9, ...
[1] Missing: 28.1%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_5, type: character
[1] Values (42 unique): NA, 66, 87, 83, 07, ...
[1] Missing: 62%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_5, type: numeric
[1] Values (6 unique): NA, 2, 5, 3, 4, ...
[1] Missing: 66.5%
[1] is used in feature engineering and hence not included
```

[1] Variable: ap_year_5, type: integer

```
[1] Values (13 unique): NA, 2015, 2014, 2016, 2013, ...
[1] Missing: 62%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_essay_flag_5, type: numeric
[1] Values (11 unique): NA, 0, 5, 1, 3, ...
[1] Missing: 28.1%
[1] is used in feature engineering and hence not included
[1] ______
[1] Variable: ap_code_6, type: character
[1] Values (40 unique): NA, 07, 93, 90, 20, ...
[1] Missing: 70.3%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_6, type: numeric
[1] Values (6 unique): NA, 1, 4, 3, 2, ...
[1] Missing: 73.2%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_6, type: integer
[1] Values (13 unique): NA, 2014, 2015, 2013, 2016, ...
[1] Missing: 70.3%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_6, type: numeric
[1] Values (11 unique): NA, 2, 0, 3, 4, ...
[1] Missing: 82.6%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_7, type: character
[1] Values (42 unique): NA, 36, 07, 66, 90, ...
[1] Missing: 78.4%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_7, type: numeric
[1] Values (6 unique): NA, 3, 2, 1, 5, ...
[1] Missing: 80.2%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_7, type: integer
[1] Values (13 unique): NA, 2014, 2015, 2013, 2016, ...
[1] Missing: 78.4%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_7, type: numeric
[1] Values (11 unique): NA, 3, 0, 1, 5, ...
[1] Missing: 87.5%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_8, type: character
[1] Values (39 unique): NA, 78, 20, 36, 93, ...
[1] Missing: 85.3%
[1] is used in feature engineering and hence not included
[1] _____
```

```
[1] Variable: ap_score_8, type: numeric
[1] Values (6 unique): NA, 2, 3, 5, 4, ...
[1] Missing: 86.6%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_8, type: integer
[1] Values (13 unique): NA, 2014, 2015, 2013, 2012, ...
[1] Missing: 85.3%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_8, type: numeric
[1] Values (11 unique): NA, 0, 3, 1, 5, ...
[1] Missing: 91.8%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_9, type: character
[1] Values (38 unique): NA, 36, 93, 87, 53, ...
[1] Missing: 90.8%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_9, type: numeric
[1] Values (6 unique): NA, 3, 5, 2, 4, ...
[1] Missing: 91.7%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_9, type: integer
[1] Values (11 unique): NA, 2014, 2015, 2013, 2012, ...
[1] Missing: 90.8%
[1] is used in feature engineering and hence not included
[1] ______
[1] Variable: ap_essay_flag_9, type: numeric
[1] Values (11 unique): NA, 0, 1, 2, 5, ...
[1] Missing: 95%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_10, type: character
[1] Values (40 unique): NA, 66, 53, 93, 85, ...
[1] Missing: 94.7%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_10, type: numeric
[1] Values (6 unique): NA, 3, 4, 2, 5, ...
[1] Missing: 95.3%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_year_10, type: integer
[1] Values (10 unique): NA, 2014, 2013, 2015, 2012, ...
[1] Missing: 94.7%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_10, type: numeric
[1] Values (11 unique): NA, 0, 1, 2, 3, ...
[1] Missing: 97.3%
[1] is used in feature engineering and hence not included
```

```
[1] Variable: ap_code_11, type: character
[1] Values (35 unique): NA, 43, 66, 90, 69, ...
[1] Missing: 97.3%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_11, type: numeric
[1] Values (6 unique): NA, 3, 4, 5, 1, ...
[1] Missing: 97.6%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_year_11, type: integer
[1] Values (10 unique): NA, 2013, 2014, 2015, 2011, ...
[1] Missing: 97.3%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_essay_flag_11, type: numeric
[1] Values (10 unique): NA, 0, 1, 2, 5, ...
[1] Missing: 98.6%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_12, type: character
[1] Values (31 unique): NA, 43, 66, 78, 90, ...
[1] Missing: 98.7%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_12, type: numeric
[1] Values (6 unique): NA, 3, 1, 5, 4, ...
[1] Missing: 98.9%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_12, type: integer
[1] Values (10 unique): NA, 2013, 2014, 2015, 2011, ...
[1] Missing: 98.7%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_12, type: numeric
[1] Values (10 unique): NA, 0, 1, 5, 2, ...
[1] Missing: 99.4%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_13, type: character
[1] Values (27 unique): NA, 83, 57, 93, 43, ...
[1] Missing: 99.4%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_13, type: numeric
[1] Values (6 unique): NA, 4, 3, 5, 1, ...
[1] Missing: 99.5%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_13, type: integer
[1] Values (10 unique): NA, 2015, 2014, 2013, 2012, ...
[1] Missing: 99.4%
```

```
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_essay_flag_13, type: numeric
[1] Values (8 unique): NA, 0, 2, 1, 5, ...
[1] Missing: 99.7%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_code_14, type: character
[1] Values (26 unique): NA, 43, 87, 28, 78, ...
[1] Missing: 99.8%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_14, type: numeric
[1] Values (6 unique): NA, 4, 5, 1, 3, ...
[1] Missing: 99.8%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_14, type: integer
[1] Values (9 unique): NA, 2014, 2013, 2012, 2015, ...
[1] Missing: 99.8%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_14, type: numeric
[1] Values (6 unique): NA, 0, 1, 2, 5, ...
[1] Missing: 99.9%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_code_15, type: character
[1] Values (18 unique): NA, 66, 53, 90, 07, ...
[1] Missing: 99.9%
[1] is used in feature engineering and hence not included
[1] _____
[1] Variable: ap_score_15, type: numeric
[1] Values (6 unique): NA, 2, 4, 3, 1, ...
[1] Missing: 99.9%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_15, type: integer
[1] Values (9 unique): NA, 2013, 2014, 2012, 2015, ...
[1] Missing: 99.9%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_15, type: numeric
[1] Values (5 unique): NA, 0, 7, 5, 1
[1] Missing: 99.9%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_code_16, type: character
[1] Values (11 unique): NA, 93, 25, 43, 90, ...
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_16, type: numeric
[1] Values (6 unique): NA, 3, 1, 4, 2, ...
```

```
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_16, type: integer
[1] Values (9 unique): NA, 2013, 2014, 2015, 2012, ...
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] _____
[1] Variable: ap_essay_flag_16, type: numeric
[1] Values (3 unique): NA, 0, 5
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_17, type: character
[1] Values (5 unique): NA, 93, 53, 43, 60
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_17, type: numeric
[1] Values (4 unique): NA, 1, 3, 4
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] ______
[1] Variable: ap_year_17, type: integer
[1] Values (4 unique): NA, 2012, 2014, 2011
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_essay_flag_17, type: numeric
[1] Values (3 unique): NA, 5, 0
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_18, type: character
[1] Values (3 unique): NA, 20, 69
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] _____
[1] Variable: ap_score_18, type: numeric
[1] Values (2 unique): NA, 4
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_year_18, type: integer
[1] Values (3 unique): NA, 2012, 2014
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_18, type: numeric
[1] Values (2 unique): NA, 0
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_19, type: character
```

```
[1] Values (2 unique): NA, 78
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_score_19, type: numeric
[1] Values (2 unique): NA, 1
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] _____
[1] Variable: ap_year_19, type: integer
[1] Values (2 unique): NA, 2014
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_19, type: numeric
[1] Values (2 unique): NA, 0
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_code_20, type: character
[1] Values (2 unique): NA, 82
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_score_20, type: numeric
[1] Values (2 unique): NA, 1
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1]
[1] Variable: ap_year_20, type: integer
[1] Values (2 unique): NA, 2014
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] Variable: ap_essay_flag_20, type: numeric
[1] Values (2 unique): NA, 0
[1] Missing: 100%
[1] is used in feature engineering and hence not included
[1] _____
[1] Variable: current_ind, type: numeric
[1] Values (1 unique): 1
[1] Missing: 0%
[1]
[1] Variable: eff_start_dt, type: character
[1] Values (16 unique): 12/01/2021 09:59:41, 04/13/2022 15:43:46, 04/13/2022 16:11:43, 04/14/2022 09:03
[1] Missing: 0%
[1]
[1] Variable: eff_end_dt, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: parent educ, type: numeric
```

[1] Values (9 unique): 7, 8, 5, 3, NA, ...

[1] Missing: 9.4%

These are the predictors that remain when filtering for less than 50% missing, our blacklist and variables that need to be somehow transformed first:

```
[1] "gender"
                            "female"
                                                   "int student"
[4] "ethnicity"
                            "asian"
                                                   "hispanic"
[7] "black"
                            "white"
                                                   "urm"
                            "first_generation"
[10] "citizenship_app"
                                                   "low_income"
[13] "father_edu_level_code" "mother_edu_level_code" "ell"
                          "single_parent" "country_residence_app"
[16] "foster_care"
                           "application term code" "application status"
[19] "geo category"
                                                   "current_ind"
[22] "admitdate"
                            "cal_res_at_app"
[25] "parent_educ"
```

Variables that are unexpectedly in the dataset

[1] _____

[1] Variable: hs_state, type: character

```
## [1] Variable: pascd, type: numeric
## [1] Values (4 unique): NA, 2, 3, 6
## [1] Missing: 0.1%
## [1]
## [1] _____
## [1] Variable: hscd, type: numeric
## [1] Values (4209 unique): NA, 1937020, 3439963, 3033570, 1933380, ...
## [1] Missing: 28.1%
## [1]
## [1] ______
## [1] Variable: must_hsid, type: numeric
## [1] Values (5493 unique): NA, 110813, 101584, 100704, 102236, ...
## [1] Missing: 28%
## [1]
## [1] _____
## [1] Variable: ncessch, type: character
## [1] Values (530 unique): NA, 061440001678, 062271003139, 040625000589, 062569007784, ...
## [1] Missing: 94.6%
## [1]
## [1]
## [1] Variable: hs_address, type: character
## [1] Values (533 unique): NA, 41717 PALM AVENUE, 3501 NORTH BROADWAY, 21200 NORTH 83 AVENUE, 4500 N T
## [1] Missing: 94.6%
## [1]
## [1] _____
## [1] Variable: hs_city, type: character
## [1] Values (451 unique): NA, FREMONT, LOS ANGELES, PEORIA, MOORPARK, ...
## [1] Missing: 94.6%
## [1]
```

```
## [1] Values (51 unique): NA, CA, AZ, DE, TX, ...
## [1] Missing: 94.6%
## [1]
## [1] _____
## [1] Variable: hs_zip, type: numeric
## [1] Values (514 unique): NA, 94539, 90031, 85382, 93021, ...
## [1] Missing: 94.6%
## [1]
## [1] ______
## [1] Variable: hs_ceeb, type: numeric
## [1] Values (1732 unique): NA, 4400, 4670, 4839, 4098, ...
## [1] Missing: 33.2%
## [1]
## [1]
## [1] Variable: uncapped_gpa, type: numeric
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1]
## [1] Variable: unweighted_gpa, type: numeric
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: grad_major_1, type: character
## [1] Values (96 unique): NA, 97220, 55120, 65867, 967A0, ...
## [1] Missing: 30.8%
## [1]
## [1] _____
## [1] Variable: grad_major_2, type: character
## [1] Values (73 unique): NA, 65836, 65246, 967A1, 7908Q, ...
## [1] Missing: 90.2%
## [1]
## [1]
## [1] Variable: grad_major_3, type: character
## [1] Values (26 unique): NA, 97220, 97632, 65246, 65836, ...
## [1] Missing: 99.7%
## [1]
## [1] ______
## [1] Variable: grad_major_1_desc, type: character
## [1] Values (94 unique): NA, Criminology, Law And Society, Biological Sciences, Sociology, Public Hea
## [1] Missing: 30.8%
## [1]
## [1] ______
## [1] Variable: grad_major_2_desc, type: character
## [1] Values (72 unique): NA, International Studies, Economics, Public Health Policy, Education Scienc
## [1] Missing: 90.2%
## [1]
## [1]
## [1] Variable: grad_major_3_desc, type: character
## [1] Values (26 unique): NA, Criminology, Law And Society, Psychology And Social Behavior, Economics,
## [1] Missing: 99.7%
## [1]
## [1] _____
```

We could think about using pascd.

Student by term

The spreadsheet knows 159 variables. The corresponding file contains 183 columns. The expected variables student_term_sid (pk),class_standing,cumulative_units_attempted_graduate,cumulative_units_attempted_online,cumulare not in the dataset. Therefore exist variables created_dttm,current_units_attempted_transfer,current_units_attempted_

Requested and available variables

```
[1] Variable: mellon_id, type: numeric
[1] Values (46408 unique): 214379, 221837, 328990, 212451, 326308, ...
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: group_a, type: numeric
[1] Values (2 unique): 0, 1
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: mellon_enr_dt_a, type: character
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: group_b, type: numeric
[1] Values (1 unique): 0
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: mellon_enr_dt_b, type: character
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: term_code, type: numeric
[1] Values (43 unique): 201814, 201592, 201514, 201692, 201403, ...
[1] Missing: 0%
[1]
[1] Variable: term_desc, type: character
[1] Values (43 unique): Spring 2018, Fall 2015, Spring 2015, Fall 2016, Winter 2014, ...
[1] Missing: 0%
[1] Variable: term_part_code, type: character
[1] Values (4 unique): 14, 92, 03, NA
[1] Missing: 0%
[1] Variable: term_part_desc, type: character
[1] Values (7 unique): Spring, Fall, Winter, NA, Winter Quarter, ...
[1] Missing: 0%
[1] Variable: enrollment_open_date, type: character
[1] Values (3 unique): NA, 11/23/2020 00:00:00.000, 02/24/2020 00:00:00.000
[1] Missing: 100%
```

```
[1] Variable: enrollment_close_date, type: character
[1] Values (3 unique): NA, 12/14/2020 00:00:00.000, 03/11/2020 00:00:00.000
[1] Missing: 100%
[1] Variable: instruction_start_date, type: character
[1] Values (3 unique): NA, 01/06/2020 00:00:00.000, 03/30/2020 00:00:00.000
[1] Missing: 100%
[1] _____
[1] Variable: instruction_end_date, type: character
[1] Values (3 unique): NA, 03/13/2020 00:00:00.000, 06/05/2020 00:00:00.000
[1] Missing: 100%
[1] ______
[1] Variable: citizenship, type: character
[1] Values (3 unique): US Citizen, Not US Citizen, NA
[1] Missing: 0%
[1] _____
[1] Variable: household size, type: numeric
[1] Values (14 unique): NA, 5, 4, 6, 2, ...
[1] Missing: 85.6%
[1]
[1] Variable: city_residence, type: character
[1] Values (2282 unique): SAN GABRIEL, RIALTO, GARDEN GROVE, IRVINE, EL MONTE, ...
[1] Missing: 0%
[1]
[1] Variable: state_residence, type: character
[1] Values (59 unique): CA, NV, NA, HI, NY, ...
[1] Missing: 4.9%
[1]
[1] Variable: country_residence, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] Variable: zip_code, type: character
[1] Values (6829 unique): 91775, 92377, 92841, 92612, 91731, ...
[1] Missing: 0%
[1]
[1] Variable: housing_status, type: character
[1] Values (3 unique): NA, On-campus, Off-campus
[1] Missing: 83%
[1]
[1] Variable: housing_status_desc, type: character
[1] Values (4 unique): NA, On-campus: UCI, Off-campus: Commuter, On-campus: ACC
[1] Missing: 83%
[1]
[1] Variable: housing_complex_name, type: character
[1] Values (15 unique): NA, Mesa Court, Off-campus commuter, Middle Earth, Vista del Campo, ...
[1] Missing: 83%
[1] Variable: currently_enrolled, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: cumulative term enroll, type: logical
```

```
[1] Values (1 unique): NA
[1] Missing: 100%
[1] Variable: levelcd, type: character
[1] Values (6 unique): 4, 2, 3, 1, NA, ...
[1] Missing: 0%
[1] _____
[1] Variable: pascd, type: numeric
[1] Values (2 unique): 2, NA
[1] Missing: 0%
[1] _____
[1] Variable: active_student, type: numeric
[1] Values (2 unique): 0, 1
[1] Missing: 0%
[1]
[1] Variable: new_student, type: character
[1] Values (4 unique): 0, C, R, P
[1] Missing: 0%
[1] Variable: full_time, type: numeric
[1] Values (2 unique): 0, 1
[1] Missing: 0%
[1] _____
[1] Variable: ferpa_blocked, type: character
[1] Values (3 unique): NA, X, Z
[1] Missing: 100%
[1]
[1] Variable: year_study, type: character
[1] Values (5 unique): Senior, Sophomore, Junior, Freshman, Limited
[1] Missing: 0%
[1] Variable: second_baccalaureate, type: numeric
[1] Values (3 unique): NA, 1, 0
[1] Missing: 100%
[1] _____
[1] Variable: dual_degree, type: numeric
[1] Values (2 unique): NA, 0
[1] Missing: 91.9%
[1] _____
[1] Variable: dual_degree_active, type: numeric
[1] Values (2 unique): NA, 0
[1] Missing: 91.9%
[1] Variable: honors, type: numeric
[1] Values (3 unique): 0, 1, NA
[1] Missing: 0%
[1] _____
[1] Variable: honors_program, type: character
[1] Values (6 unique): NA, H, O, C, S, ...
[1] Missing: 96.9%
[1]
[1] Variable: deans_list, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
```

```
[1] ______
[1] Variable: concurrent_law, type: numeric
[1] Values (2 unique): NA, 0
[1] Missing: 91.9%
[1] _____
[1] Variable: ucdc, type: numeric
[1] Values (3 unique): NA, 0, 1
[1] Missing: 91.9%
[1] _____
[1] Variable: absentia, type: numeric
[1] Values (2 unique): NA, 0
[1] Missing: 91.9%
[1]
[1] Variable: rotc, type: numeric
[1] Values (7 unique): NA, 0, 3, 1, 9, ...
[1] Missing: 91.7%
[1]
[1] Variable: reduced_ed_fee, type: numeric
[1] Values (3 unique): NA, 0, 1
[1] Missing: 91.9%
[1] _____
[1] Variable: education_abroad, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: education_opportunity, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: esl_program, type: numeric
[1] Values (2 unique): 0, 1
[1] Missing: 0%
[1] Variable: sport, type: character
[1] Values (8 unique): 1, NA, A, Z, O, ...
[1] Missing: 51.7%
[1]
[1] Variable: sport_gender, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] Variable: entry_level_writing, type: character
[1] Values (5 unique): NA, Requirement satisfied, Course passed, Test passed, Requirement not satisfied
[1] Missing: 91.9%
[1] Variable: american_history_desc, type: character
[1] Values (4 unique): NA, Requirement satisfied, Course passed, Requirement not satisfied
[1] Missing: 91.9%
[1] Variable: american_intitutions_desc, type: character
[1] Values (4 unique): NA, Requirement satisfied, Course passed, Requirement not satisfied
[1] Missing: 91.9%
[1]
```

[1] Variable: probation_status, type: character

```
[1] Values (3 unique): N, Y, NA
[1] Missing: 0%
[1] Variable: registration_status, type: character
[1] Values (7 unique): Continuing, New, Returning, Withdraw, NA, ...
[1] Missing: 0%
[1]
[1] Variable: veteran_status, type: numeric
[1] Values (3 unique): NA, 0, 1
[1] Missing: 91.9%
[1]
[1] Variable: pell_eligible_flag, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: major_count, type: numeric
[1] Values (4 unique): 1, 2, 3, 4
[1] Missing: 0%
[1] Variable: netpayer_fee_assessed, type: numeric
[1] Values (41 unique): 0, 5149.5298, 5150.54, 5223.6401, 5207.04, ...
[1] Missing: 0%
[1]
[1] Variable: current units attempted grade, type: numeric
[1] Values (65 unique): NA, 16, 12, 17, 17.5, ...
[1] Missing: 91.9%
[1] _____
[1] Variable: current_units_attempted_pnp, type: numeric
[1] Values (41 unique): NA, 0, 4, 1.3, 2, ...
[1] Missing: 91.9%
[1] _____
[1] Variable: current_units_attempted_lowerdiv, type: numeric
[1] Values (62 unique): NA, 4, 0, 13.5, 9.3000002, ...
[1] Missing: 94.8%
[1] Variable: current_units_attempted_upperdiv, type: numeric
[1] Values (46 unique): NA, 12, 16, 18, 4, ...
[1] Missing: 91.9%
[1]
[1] Variable: current_units_attempted_graduate, type: numeric
[1] Values (10 unique): NA, 0, 4, 2, 5, ...
[1] Missing: 91.9%
[1]
[1] Variable: current_units_attempted_online, type: numeric
[1] Values (18 unique): NA, 0, 8, 4, 2, ...
[1] Missing: 91.9%
[1] Variable: current_units_attempted_oncampus, type: numeric
[1] Values (92 unique): NA, 16, 20, 17, 17.5, ...
[1] Missing: 91.9%
[1] Variable: current_units_completed_graded, type: numeric
[1] Values (62 unique): NA, 16, 12, 17, 8, ...
[1] Missing: 91.9%
```

```
[1] Variable: current_units_completed_pnp, type: numeric
[1] Values (34 unique): NA, 0, 4, 1, 2, ...
[1] Missing: 91.9%
[1] Variable: current_units_completed_lowerdiv, type: numeric
[1] Values (43 unique): NA, 0, 8, 4, 9, ...
[1] Missing: 91.9%
[1] _____
[1] Variable: current_units_completed_upperdiv, type: numeric
[1] Values (36 unique): NA, 0, 20, 4, 8, ...
[1] Missing: 91.9%
[1] _____
[1] Variable: current_units_completed_graduate, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: current_units_completed_online, type: numeric
[1] Values (16 unique): NA, 0, 4, 8, 2, ...
[1] Missing: 91.9%
[1] Variable: current_units_completed_oncampus, type: numeric
[1] Values (76 unique): NA, 16, 20, 17, 8, ...
[1] Missing: 91.9%
[1]
[1] Variable: current_units_completed_transfer, type: numeric
[1] Values (1 unique): 0
[1] Missing: 0%
[1]
[1] Variable: current_units_completed_total, type: numeric
[1] Values (88 unique): 14, 12, 8, 16, 15.5, ...
[1] Missing: 0%
[1] Variable: cumulative_units_attempted_grade, type: numeric
[1] Values (535 unique): NA, 173, 172, 155, 218, ...
[1] Missing: 91.9%
[1] Variable: cumulative_units_attempted_pnp, type: numeric
[1] Values (356 unique): NA, 0, 1, 2, 7.9000001, ...
[1] Missing: 71%
[1]
[1] Variable: cumulative_units_attempted_lower, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: cumulative_units_attempted_upper, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] Variable: cumulative_units_attempted_total, type: numeric
[1] Values (1446 unique): NA, 173, 179.89999, 179, 218, ...
[1] Missing: 91.9%
[1]
[1] Variable: cumulative units completed pnp, type: numeric
```

```
[1] Values (317 unique): NA, 0, 1, 2, 7.9000001, ...
[1] Missing: 71%
[1] Variable: cumulative_units_completed_total, type: numeric
[1] Values (3031 unique): 182, 45, 225, 146, 216, ...
[1] Missing: 0%
[1]
[1] Variable: gpa_term, type: numeric
[1] Values (396 unique): 3.8, 3.53, 2.4200001, 3.5999999, 3.1700001, ...
[1] Missing: 0%
[1]
[1] Variable: gpa_cumulative, type: numeric
[1] Values (390 unique): 3.25, 3.53, 2.8299999, 3.6900001, 3.01, ...
[1] Missing: 0%
[1]
[1] Variable: major_code_1, type: character
[1] Values (106 unique): 836, 345, 284, 090, 75A, ...
[1] Missing: 0%
[1] Variable: major_name_1, type: character
[1] Values (106 unique): INTERNATIONAL STUDIES, ENGLISH, CIVIL ENGINEERING, ART, PHARMACEUTICAL SCIENCE
[1] Missing: 0%
[1] _____
[1] Variable: major name abbrev 1, type: character
[1] Values (158 unique): Bio-Ua, English, P H Sci, Art, PhrmSci, ...
[1] Missing: 0.3%
[1]
[1] Variable: major_school_code_1, type: character
[1] Values (16 unique): 55, 60, 96, 57, 93, ...
[1] Missing: 0.3%
[1]
[1] Variable: major_school_name_1, type: character
[1] Values (16 unique): School of Biological Sciences, School of Humanities, Program in Public Health,
[1] Missing: 0.3%
[1] Variable: major_school_name_abbrev_1, type: character
[1] Values (18 unique): Bio Sci, Humanities, PubHlth, Arts, Pharmacy, ...
[1] Missing: 0.3%
[1]
[1] Variable: major_subcampus_1, type: character
[1] Values (3 unique): General campus, Health science, NA
[1] Missing: 0.3%
[1]
[1] Variable: major_funding_1, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] Variable: major_cip_code_1, type: character
[1] Values (90 unique): 30.9999, 23.0101, 51.2299, 50.0101, 51.2010, ...
[1] Missing: 0.3%
[1] Variable: major cip code historical 1, type: character
[1] Values (98 unique): 30.9999, 23.0101, 51.2299, 50.0101, 51.2010, ...
[1] Missing: 0.3%
```

```
[1] Variable: major_cip_name_1, type: character
[1] Values (90 unique): Multi-/Interdisciplinary Studies, Other, English Language and Literature, Gener
[1] Missing: 0.3%
[1] Variable: major_cip_series_code_1, type: character
[1] Values (21 unique): 30, 23, 51, 50, 26, ...
[1] Missing: 0.3%
[1] _____
[1] Variable: major_cip_series_name_1, type: character
[1] Values (22 unique): Multi/Interdisciplinary Studies, English Language and Literature/Letters, Healt
[1] Missing: 0.3%
[1]
[1] Variable: major_cip_category_code_1, type: character
[1] Values (69 unique): 30.99, 23.01, 51.22, 50.01, 51.20, ...
[1] Missing: 0.3%
[1] Variable: major_cip_category_name_1, type: character
[1] Values (69 unique): Multi/Interdisciplinary Studies, Other, English Language and Literature, Genera
[1] Missing: 0.3%
[1]
[1] Variable: major_stem_1, type: numeric
[1] Values (3 unique): 0, 1, NA
[1] Missing: 0.3%
[1]
[1] Variable: major_degree_granting_1, type: numeric
[1] Values (3 unique): NA, 1, 0
[1] Missing: 91.9%
[1]
[1] Variable: major_graduated_1, type: character
[1] Values (147 unique): NA, Civil Engineering, Mathematics, URBAN STUDIES, PSYCH & SOC BEHAVIOR, ...
[1] Missing: 90.3%
[1] Variable: major_code_2, type: character
[1] Values (94 unique): NA, 836, 632, 780, 851, ...
[1] Missing: 92.1%
[1] Variable: major_name_2, type: character
[1] Values (94 unique): NA, INTERNATIONAL STUDIES, PSYCHOLOGY AND SOCIAL BEHAVIOR, PSYCHOLOGY_BA, SOCIAL
[1] Missing: 92.1%
[1] Variable: major_name_abbrev_2, type: character
[1] Values (93 unique): NA, Intl St, Psy Beh, Psych, SocEcol, ...
[1] Missing: 92.2%
[1]
[1] Variable: major_school_code_2, type: numeric
[1] Values (13 unique): NA, 65, 97, 77, 60, ...
[1] Missing: 92.2%
[1] Variable: major_school_name_2, type: character
[1] Values (13 unique): NA, School of Social Sciences, School of Social Ecology, School of Engineering,
[1] Missing: 92.2%
[1] _____
```

[1] Variable: major school name abbrev 2, type: character

```
[1] Values (14 unique): NA, Soc Sci, Soc Ecol, Engr, Humanities, ...
[1] Missing: 92.2%
[1] Variable: major_subcampus_2, type: character
[1] Values (3 unique): NA, General campus, Health science
[1] Missing: 92.2%
[1] Variable: major_funding_2, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: major_cip_code_2, type: numeric
[1] Values (68 unique): NA, 42.2707, 45.1001, 45.1101, 42.2799, ...
[1] Missing: 98.8%
[1]
[1] Variable: major_cip_code_historical_2, type: numeric
[1] Values (69 unique): NA, 42.2707, 45.1001, 45.1101, 42.2799, ...
[1] Missing: 98.8%
[1] Variable: major_cip_name_2, type: character
[1] Values (68 unique): NA, Social Psychology, Political Science and Government, General, Sociology, Re
[1] Missing: 98.8%
[1] _____
[1] Variable: major_cip_series_code_2, type: numeric
[1] Values (20 unique): NA, 42, 45, 23, 50, ...
[1] Missing: 98.8%
[1]
[1] Variable: major_cip_series_name_2, type: character
[1] Values (21 unique): NA, Psychology, Social Sciences, English Language and Literature/Letters, Visua
[1] Missing: 98.8%
[1] _____
[1] Variable: major_cip_category_code_2, type: numeric
[1] Values (55 unique): NA, 42.27, 45.1, 45.11, 23.01, ...
[1] Missing: 98.8%
[1] Variable: major_cip_category_name_2, type: character
[1] Values (55 unique): NA, Research and Experimental Psychology, Political Science and Government, Soc
[1] Missing: 98.8%
[1] _____
[1] Variable: major_stem_2, type: numeric
[1] Values (3 unique): NA, 0, 1
[1] Missing: 92.2%
[1]
[1] Variable: major_degree_granting_2, type: numeric
[1] Values (2 unique): NA, 1
[1] Missing: 98.8%
[1] Variable: major_graduated_2, type: character
[1] Values (102 unique): INTERNATIONAL STUDIES, ENGLISH, CIVIL ENGINEERING, ART, PHARMACEUTICAL SCI, ..
[1] Missing: 5.8%
[1]
[1] Variable: major_code_3, type: character
[1] Values (49 unique): NA, 666, 540, 16A, 277, ...
```

[1] Missing: 99.8%

```
[1] Variable: major_name_3, type: character
[1] Values (49 unique): NA, PHYSICS, MATHEMATICS, CHICANO/LATINO STUDIES, MECHANICAL ENGINEERING, ...
[1] Missing: 99.8%
[1] Variable: major_name_abbrev_3, type: character
[1] Values (46 unique): NA, Physics, Math, Chc/Lat, Engr ME, ...
[1] Missing: 99.8%
[1] ______
[1] Variable: major_school_code_3, type: numeric
[1] Values (11 unique): NA, 62, 65, 77, 60, ...
[1] Missing: 99.8%
[1]
[1] Variable: major_school_name_3, type: character
[1] Values (11 unique): NA, School of Physical Sciences, School of Social Sciences, School of Engineeri
[1] Missing: 99.8%
[1] Variable: major_school_name_abbrev_3, type: character
[1] Values (11 unique): NA, PhySci, Soc Sci, Engr, Humanities, ...
[1] Missing: 99.8%
[1]
[1] Variable: major_subcampus_3, type: character
[1] Values (3 unique): NA, General campus, Health science
[1] Missing: 99.8%
[1]
[1] Variable: major_funding_3, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: major_stem_3, type: numeric
[1] Values (3 unique): NA, 1, 0
[1] Missing: 99.8%
[1] Variable: major_degree_granting_3, type: numeric
[1] Values (2 unique): NA, 1
[1] Missing: 100%
[1] Variable: major_graduated_3, type: character
[1] Values (35 unique): NA, URBAN STUDIES, BIOMEDICAL ENGR, MATERIALS SCI ENGR, SOCIAL ECOLOGY, ...
[1] Missing: 99.9%
[1] Variable: major_code_4, type: character
[1] Values (5 unique): NA, OEH, 632, 867, 912
[1] Missing: 100%
[1]
[1] Variable: major_name_4, type: character
[1] Values (5 unique): NA, PSYCHOLOGICAL SCIENCE, PSYCHOLOGY AND SOCIAL BEHAVIOR, SOCIOLOGY, URBAN STUD
[1] Missing: 100%
[1] Variable: major_name_abbrev_4, type: character
[1] Values (4 unique): NA, PsychSc, Sociol, UrbanSt
[1] Missing: 100%
[1] _____
```

[1] Variable: major school code 4, type: numeric

```
[1] Values (3 unique): NA, 97, 65
[1] Missing: 100%
[1] Variable: major_school_name_4, type: character
[1] Values (3 unique): NA, School of Social Ecology, School of Social Sciences
[1] Missing: 100%
[1] Variable: major_school_name_abbrev_4, type: character
[1] Values (3 unique): NA, Soc Ecol, Soc Sci
[1] Missing: 100%
[1] _____
[1] Variable: major_subcampus_4, type: character
[1] Values (2 unique): NA, General campus
[1] Missing: 100%
[1] _____
[1] Variable: major_funding_4, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] Variable: major_stem_4, type: numeric
[1] Values (2 unique): NA, 0
[1] Missing: 100%
[1] _____
[1] Variable: major_degree_granting_4, type: numeric
[1] Values (2 unique): NA, 1
[1] Missing: 100%
[1] _____
[1] Variable: major_graduated_4, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: major_minor, type: character
[1] Values (85 unique): NA, GENDER & SEXUALITY STUDIES, PSYCHOLOGY, KOREAN LIT & CULTURE, ART HISTORY,
[1] Missing: 77.8%
[1] Variable: current_ind, type: logical
[1] Values (1 unique): NA
[1] Missing: 100%
```

These are the predictors that remain when filtering for less than 50% missing, our blacklist and variables that need to be somehow transformed first:

```
"term_part_desc"
[1] "term_part_code"
[3] "citizenship"
                                         "levelcd"
[5] "pascd"
                                         "active_student"
[7] "new_student"
                                         "full time"
[9] "year_study"
                                         "honors"
[11] "esl_program"
                                        "probation_status"
[13] "registration status"
                                        "major count"
[15] "current_units_completed_transfer" "major_subcampus_1"
[17] "major_stem_1"
```

[1]

Variables that are unexpectedly in the dataset

```
## [1] Variable: created_dttm, type: character
## [1] Values (68 unique): 04/08/2022 13:10:30.000, 04/09/2022 09:08:26.000, 04/08/2022 12:20:39.000, 1
## [1] Missing: 0%
## [1]
## [1] ______
## [1] Variable: current_units_attempted_transfer, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: current_units_attempted_total, type: numeric
## [1] Values (92 unique): NA, 16, 20, 17, 17.5, ...
## [1] Missing: 91.9%
## [1]
## [1] _____
## [1] Variable: cumulative units attempted gradu, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1]
## [1] Variable: cumulative_units_attempted_onlin, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: cumulative_units_attempted_oncam, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] _____
## [1] Variable: cumulative_units_attempted_trans, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: cumulative_units_completed_grade, type: numeric
## [1] Values (493 unique): NA, 173, 168, 155, 218, ...
## [1] Missing: 91.9%
## [1]
## [1] Variable: cumulative_units_completed_lower, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] _____
## [1] Variable: cumulative units completed upper, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1]
## [1] Variable: cumulative_units_completed_gradu, type: logical
## [1] Values (1 unique): NA
```

```
## [1] Missing: 100%
## [1]
## [1] _____
## [1] Variable: cumulative_units_completed_onlin, type: numeric
## [1] Values (73 unique): NA, 4, 0, 8, 28, ...
## [1] Missing: 91.9%
## [1]
## [1] _____
## [1] Variable: cumulative_units_completed_oncam, type: numeric
## [1] Values (1470 unique): NA, 173, 175.89999, 175, 218, ...
## [1] Missing: 91.9%
## [1]
## [1]
## [1] Variable: cumulative_units_completed_trans, type: numeric
## [1] Values (281 unique): 0, 12, 16, 44, 66.5, ...
## [1] Missing: 0%
## [1]
## [1]
## [1] Variable: total_terms_enrolled_excluding_s, type: numeric
## [1] Values (23 unique): 0, 12, 9, 14, 6, ...
## [1] Missing: 0%
## [1]
## [1] _____
## [1] Variable: total_terms_enrolled_including_s, type: numeric
## [1] Values (28 unique): NA, 14, 12, 9, 11, ...
## [1] Missing: 91.9%
## [1]
## [1] ______
## [1] Variable: major_cip_code_3, type: numeric
## [1] Values (21 unique): NA, 40.0801, 45.1101, 42.0101, 27.0101, ...
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: major_cip_code_historical_3, type: numeric
## [1] Values (21 unique): NA, 40.0801, 45.1101, 42.0101, 27.0101, ...
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: major_cip_name_3, type: character
## [1] Values (21 unique): NA, Physics, General, Sociology, Psychology, General, Mathematics, General,
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: major_cip_series_code_3, type: numeric
## [1] Values (12 unique): NA, 40, 45, 42, 27, ...
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: major_cip_series_name_3, type: character
## [1] Values (12 unique): NA, Physical Sciences, Social Sciences, Psychology, Mathematics and Statisti
## [1] Missing: 100%
## [1]
## [1] _____
## [1] Variable: major_cip_category_code_3, type: numeric
```

```
## [1] Values (20 unique): NA, 40.08, 45.11, 42.01, 27.01, ...
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: major_cip_category_name_3, type: character
## [1] Values (20 unique): NA, Physics, Sociology, Psychology, General, Mathematics, ...
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: major_cip_code_4, type: numeric
## [1] Values (4 unique): NA, 42.2799, 45.1101, 45.1201
## [1] Missing: 100%
## [1]
## [1]
## [1] Variable: major_cip_code_historical_4, type: numeric
## [1] Values (4 unique): NA, 42.2799, 45.1101, 45.1201
## [1] Missing: 100%
## [1]
## [1]
## [1] Variable: major_cip_name_4, type: character
## [1] Values (4 unique): NA, Research and Experimental Psychology, Other., Sociology, Urban Studies/Af
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: major_cip_series_code_4, type: numeric
## [1] Values (3 unique): NA, 42, 45
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: major_cip_series_name_4, type: character
## [1] Values (3 unique): NA, Psychology, Social Sciences
## [1] Missing: 100%
## [1]
## [1] _____
## [1] Variable: major_cip_category_code_4, type: numeric
## [1] Values (4 unique): NA, 42.27, 45.11, 45.12
## [1] Missing: 100%
## [1]
## [1] _____
## [1] Variable: major_cip_category_name_4, type: character
## [1] Values (4 unique): NA, Research and Experimental Psychology, Sociology, Urban Studies/Affairs
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: pell_grant_eligibility, type: character
## [1] Values (4 unique): NA, N, P, F
## [1] Missing: 88.5%
## [1]
## [1]
## [1] Variable: pell_grant_received, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] _____
```

```
## [1] Variable: md5, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1]
## [1] Variable: effective_date, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] _____
## [1] Variable: end_effective_date, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] _____
## [1] Variable: mapping_nm, type: logical
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] ______
## [1] Variable: maj_tag1, type: numeric
## [1] Values (4 unique): 2, 1, 15, 8
## [1] Missing: 0%
## [1]
## [1] _____
## [1] Variable: maj_tag2, type: numeric
## [1] Values (6 unique): 17, 9, 1, 15, 8, ...
## [1] Missing: 0%
## [1]
## [1]
## [1] Variable: maj_tag3, type: numeric
## [1] Values (5 unique): 17, 1, 9, 15, 16
## [1] Missing: 0%
## [1]
## [1]
## [1] Variable: maj_tag4, type: numeric
## [1] Values (3 unique): 17, 1, 15
## [1] Missing: 0%
## [1]
## [1] _____
## [1] Variable: acadyr, type: character
## [1] Values (14 unique): 2017-2018, 2015-2016, 2014-2015, 2016-2017, 2013-2014, ...
## [1] Missing: 0%
## [1]
## [1]
## [1] Variable: mellon_yr, type: numeric
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1]
```

We could think about using maj_tag1,maj_tag2,maj_tag3,maj_tag4.

Student by term by course

The spreadsheet knows 52 variables. The corresponding file contains 55 columns. The expected variables are not in the dataset. Therefore exist variables year, acadyr, mellon_yr

Requested and available variables

```
[1] Variable: mellon_id, type: numeric
[1] Values (46281 unique): 3022066, 167308, 2959537, 2971243, 3026122, ...
[1] Missing: 0%
[1] should not be used as a predictor
[1]
[1] Variable: group_a, type: numeric
[1] Values (2 unique): 0, 1
[1] Missing: 0%
[1] should not be used as a predictor
[1] Variable: mellon_enr_dt_a, type: character
[1] Values (1 unique): NA
[1] Missing: 100%
[1] ______
[1] Variable: group_b, type: numeric
[1] Values (1 unique): 0
[1] Missing: 0%
[1] should not be used as a predictor
[1]
[1] Variable: mellon_enr_dt_b, type: character
[1] Values (1 unique): NA
[1] Missing: 100%
[1] Variable: term_code, type: numeric
[1] Values (42 unique): 200892, 200903, 200914, 200992, 201003, ...
[1] Missing: 0%
[1]
[1] Variable: term_desc, type: character
[1] Values (42 unique): Fall 2008, Winter 2009, Spring 2009, Fall 2009, Winter 2010, ...
[1] Missing: 0%
[1]
[1] Variable: course_code, type: NA
[1] Values (24810 unique): 20075, 20000, 20001, 20005, 20006, ...
[1] Missing: 0%
[1] Variable: course_code_concat, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: course_title, type: NA
[1] Values (6026 unique): NA, FEAR-REBEL SLAVES, RACE AND GENDER, ART&COLONIAL AFRICA, RACE & ETHNICITY
[1] Missing: 52.4%
[1] Variable: course_dept_code_and_num, type: NA
[1] Values (4449 unique): AFAM 158, AFAM 40A, ANTHRO 121D, ANTHRO 139, ANTHRO 169, ...
[1] Missing: 0%
```

```
[1] _____
[1] Variable: course_section_num, type: NA
[1] Values (1142 unique): A, 1, 5, 6, B, ...
[1] Missing: 0%
[1] Variable: course_section_title, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1] ______
[1] Variable: school_code, type: NA
[1] Values (22 unique): 65, 08, 77, 62, 97, ...
[1] Missing: 71%
[1]
[1] Variable: school_name_abbrev, type: NA
[1] Values (21 unique): Soc Sci, Unaffiliated, Engr, Phys Sci, Soc Ecol, ...
[1] Missing: 71%
[1]
[1] Variable: dept_code, type: NA
[1] Values (97 unique): AFAM, NA, ANTHRO, ART STU, ASIANAM, ...
[1] Missing: 72.9%
[1]
[1] Variable: dept_name_abbrev, type: NA
[1] Values (111 unique): AFAM, ANTHRO, ARTHIS, ARTS, ARTSTU, ...
[1] Missing: 0%
[1] _____
[1] Variable: course_level, type: NA
[1] Values (3 unique): Undergraduate, NA, Graduate
[1] Missing: 72.9%
[1]
[1] Variable: course_type, type: NA
[1] Values (12 unique): NA, LEC, DIS, LAB, TUT, ...
[1] Missing: 52.4%
[1] Variable: meeting_schedule, type: NA
[1] Values (2402 unique): NA, T T 09:30-10:50, T T 12:30-01:50P, M 02:00-04:50P, T T 11:00-12:20, ...
[1] Missing: 8.1%
[1]
[1] Variable: meeting_location, type: NA
[1] Values (947 unique): NA, DBH 1427, HOB2 131, PCB 1200, CRCC 102, ...
[1] Missing: 8.8%
[1] Variable: enroll_restrictions, type: NA
[1] Values (20 unique): NA, A, B, X, T, ...
[1] Missing: 72.2%
[1]
[1] Variable: enroll_restrictions_desc, type: NA
[1] Values (15 unique): NA, Prerequisite required, Pass/Not Pass option only, Authorization code requir
[1] Missing: 95.5%
[1] Variable: class_weeks, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
```

[1] Variable: instructor_id, type: NA

```
[1] Values (9837 unique): NA, 1719045, 1712940, 1716270, 1711402, ...
[1] Missing: 53%
[1] Variable: instructor_title, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: honors_course, type: NA
[1] Values (3 unique): 0, NA, 1
[1] Missing: 72.9%
[1] _____
[1] Variable: transferring_inst, type: NA
[1] Values (2 unique): &, NA
[1] Missing: 72.9%
[1]
[1] Variable: online_course, type: NA
[1] Values (3 unique): 0, NA, 1
[1] Missing: 72.9%
[1] Variable: min_units, type: NA
[1] Values (12 unique): 4, 0, 2, 1, 3, ...
[1] Missing: 0%
[1] _____
[1] Variable: max_units, type: NA
[1] Values (13 unique): 4, 0, 2, 1, 3, ...
[1] Missing: 7.1%
[1]
[1] Variable: max_seats, type: NA
[1] Values (399 unique): NA, 18, 16, 316, 501, ...
[1] Missing: 92.6%
[1] Variable: students_waitlisted, type: NA
[1] Values (24 unique): NA, 0, 10, 4, 2, ...
[1] Missing: 92.6%
[1] Variable: seats_requested, type: NA
[1] Values (752 unique): NA, 14, 28, 29, 39, ...
[1] Missing: 52.4%
[1]
[1] Variable: in_progress, type: NA
[1] Values (2 unique): NA, 1
[1] Missing: 92.6%
[1] Variable: enrollment_status, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: course_syllabus, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: section_start_at, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
```

```
[1] ______
[1] Variable: section_end_at, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1] ______
[1] Variable: credit_code, type: NA
[1] Values (4 unique): NA, NAT, PN, WC
[1] Missing: 99.3%
[1] ______
[1] Variable: repeat_code, type: NA
[1] Values (8 unique): NA, NAT, GO, G1, PG, ...
[1] Missing: 99.3%
[1] _____
[1] Variable: workload_credit_only, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: include_gpa, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: include_units_attempted, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1] _____
[1] Variable: include_units_completed, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: units_attempted, type: NA
[1] Values (17 unique): 4, 0, 2, 1, 3, ...
[1] Missing: 6.6%
[1] Variable: units_completed, type: NA
[1] Values (33 unique): 4, NA, 3, 2, 5, ...
[1] Missing: 45.7%
[1] Variable: midterm_grade, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1] Variable: final_score_canvas, type: NA
[1] Values (1 unique): NA
[1] Missing: 100%
[1]
[1] Variable: final_grade, type: NA
[1] Values (26 unique): A-, B-, B+, B, CR, ...
[1] Missing: 2.5%
[1] Variable: final_grade_date, type: NA
[1] Values (42 unique): NA, 2019-12-19, 2019-12-23, 2020-01-28, 2020-01-16, ...
[1] Missing: 99.3%
[1]
[1] Variable: final_grade_official, type: NA
```

```
[1] Values (1 unique): NA
[1] Missing: 100%
[1] ______
```

These are the predictors that remain when filtering for less than 50% missing, our blacklist and variables that need to be somehow transformed first:

NULL

Variables that are unexpectedly in the dataset

```
## [1] Variable: year, type: NA
## [1] Values (15 unique): 2008, 2009, 2010, 2011, 2012, ...
## [1] Missing: 0%
## [1]
## [1]
## [1] _______
## [1] Variable: acadyr, type: character
## [1] Values (14 unique): 2008-2009, 2009-2010, 2010-2011, 2011-2012, 2012-2013, ...
## [1] Missing: 0%
## [1]
## [1] _______
## [1] Variable: mellon_yr, type: numeric
## [1] Values (1 unique): NA
## [1] Missing: 100%
## [1]
## [1] _______
```

We could think about using .