# MI subs

### April 25, 2022

## 0.1 Analyze data from the Michigan Department of Health and Human Services

```
[1]: import pandas as pd
[2]: pd.set_option("display.max_row", 300)
     pd.set_option("display.max_columns", 300)
     pd.set_option("display.max_seq_items", 300)
[3]: # Load full data
     df = (
        pd
         .read_csv(
             "../../data/states/michigan/mi_full.csv",
             skiprows = 0,
             parse_dates = ["complaint_date"],
             dtype={"ONGOING_CSE_ID": "str"}
         )
         .assign(
             risk = lambda x: x["Risk Level Reworked"].str.strip(),
             year = lambda x: x["complaint_date"].dt.year
         .drop("Risk Level Reworked", axis = 1)
     df.columns = [ each.strip() for each in df.columns ]
     #df.head()
[4]: # Load county census demos
     county = (
         pd
         .read_csv(
             "../../data/national/county_B03002.csv",
             dtype = {
                 "fips": object,
             }
         .loc[ lambda x: x["state"] == "Michigan" ]
```

```
)
     county.head(3)
[4]:
                     fips
                                                       total
                                                              non_hispanic
                                                                              white
                                                name
     1231
           0500000US26001
                            Alcona County, Michigan
                                                       10353
                                                                      10198
                                                                               9916
           0500000US26003
                             Alger County, Michigan
                                                                       9007
                                                                               7650
     1232
                                                        9151
     1233
           0500000US26005
                           Allegan County, Michigan
                                                      116143
                                                                     107611
                                                                             102709
           black
                 native
                          asian pac
                                       other
                                                    hispanic
                                                              year
                                                                        state \
                                               two
     1231
              41
                      60
                             20
                                    7
                                                              2019
                                           4
                                               150
                                                         155
                                                                    Michigan
     1232
             702
                     334
                             13
                                    0
                                           0
                                               308
                                                         144
                                                              2019
                                                                     Michigan
     1233
            1426
                     364
                            802
                                    0
                                         132
                                              2178
                                                        8532 2019
                                                                    Michigan
            county
     1231
            Alcona
     1232
             Alger
     1233 Allegan
[5]: # Load state census demos
     state = (
         pd
         .read_csv(
             "../../data/national/state_B03002.csv"
         )
         .loc[ lambda x: x["state"] == "Michigan" ]
     )
     state.head()
[5]:
            total
                   non_hispanic
                                    white
                                             black native
                                                             asian
                                                                      pac
                                                                           other \
     22
          9900571
                        9433550
                                 7513622
                                          1366632
                                                     47055
                                                            267671
                                                                     1823
                                                                           12083
     74
          9920621
                        9488578
                                 7609623
                                           1381897
                                                     48838
                                                            243249
                                                                     2389
                                                                           12104
     126 9952687
                                                                     2378
                                                                           13427
                        9529275
                                 7654981
                                           1389178
                                                     48753
                                                            241673
     178
         9973907
                                 7428622
                                                                     2675
                                                                           27247
                        9452704
                                           1342592
                                                     42931
                                                             314736
                                 7526388
     230
         9889024
                        9431915
                                          1368159
                                                     48437
                                                            257464
                                                                     1757
                                                                           11526
             two hispanic
                                    fips
                                             state
                                                    year
                    467021 0400000US26
     22
          224664
                                          Michigan 2015
     74
          190478
                    432043 0400000US26
                                          Michigan 2011
     126 178885
                    423412 0400000US26
                                          Michigan
                                                    2010
                                          Michigan 2020
     178 293901
                    521203
                            040000US26
     230
         218184
                    457109 0400000US26
                                          Michigan 2014
[6]: # yearly substantiations
     yearly = (
         df
```

```
.loc[ lambda x: x["year"] > 2009 ]
         .groupby("year")["src_person_id"]
         .nunique()
         .to_frame("subs")
         .reset_index()
    )
    yearly.to_csv("../../outputs/MI_yearly_subs.csv", index = False)
    yearly
[6]:
        year
               subs
        2010
               4878
        2011
               5432
    1
    2
        2012
               6323
    3
        2013
              7394
    4
        2014
              7112
        2015
              8537
    5
        2016
              9832
    7
        2017 11581
    8
        2018 13910
        2019 17240
    9
    10 2020 16458
    11 2021 12143
[7]: # Race by percent of registry
    all_reg = df["src_person_id"].nunique()
    byRace = (
        df
         .groupby("src_person_id")["MultiRaceDesc2"]
         .first()
        .reset index()
         .groupby("MultiRaceDesc2")
         .count()
         .assign(
            percent_registry = lambda x: round((x["src_person_id"]/all_reg), 3)
         .reset_index()
    )
    byRace
[7]:
        MultiRaceDesc2 src_person_id percent_registry
                 Asian
                                  349
                                                  0.003
    0
    1
                 Black
                                26784
                                                  0.222
```

0.049

5928

2

Hispanic

```
4 Native American
                                    441
                                                    0.004
                                  1652
                                                    0.014
     5
                Unknown
                  White
                                  78268
                                                    0.647
     6
[8]: raceYear = (
         df
         # remove dupes
         .groupby(["year", "src_person_id", "MultiRaceDesc2"])
         .first()
         .reset index()
         .groupby(["year", "MultiRaceDesc2"])
         .pipe( lambda grp: pd.DataFrame({
             "count": grp.size()
         }))
         .reset_index()
         .rename(columns = {"MultiRaceDesc2": "race"})
         .sort values(
             "year",
             ascending = False
         )
     )
     #raceYear.head()
[9]: raceCountyYear = (
         # remove dupes
         .groupby(["year", "countyname", "src_person_id", "MultiRaceDesc2"])
         .first()
         .reset_index()
         .groupby(["year", "countyname", "MultiRaceDesc2"])
         .pipe( lambda grp: pd.DataFrame({
             "count": grp.size()
         }))
         .reset_index()
         .rename(columns = {"MultiRaceDesc2": "race"})
         .sort_values(
             "year",
```

7477

3

Multi Race

ascending = False

#raceCountyYear.head()

)

)

0.062

```
[10]: # helper to calculate percents across rows
def percent(row):
```

```
total = row.sum()
         return row.apply( lambda x: x/total )
[11]: # race by percent
         raceYear
          .groupby(["year", "race"])
          ["count"]
          .sum()
          .unstack()
          .reset_index("year")
         .loc[ lambda x: x["year"] > 2009 ]
         .set_index("year")
         .apply( percent )
     )
[11]: race
                        Black Hispanic Multi Race Native American
                                                                      Unknown \
              Asian
     year
     2010 0.054441 0.043301 0.037819
                                          0.036120
                                                           0.027211 0.008475
     2011 0.074499 0.045468 0.035455
                                          0.045351
                                                           0.040816
                                                                     0.013923
     2012 0.065903 0.050587 0.050481
                                          0.061538
                                                           0.043084
                                                                     0.018765
     2013 0.060172 0.057872 0.050819
                                          0.073177
                                                           0.058957
                                                                     0.018765
     2014 0.060172 0.054248 0.052338
                                                           0.038549 0.313559
                                          0.059799
     2015 0.071633 0.061795 0.062637
                                          0.069833
                                                           0.065760 0.378329
     2016 0.100287 0.083464 0.086612
                                          0.079732
                                                           0.074830 0.104722
     2017 0.120344 0.099679 0.105521
                                          0.086288
                                                           0.102041 0.039346
                                          0.106622
     2018 0.094556 0.116566 0.120041
                                                           0.117914 0.033293
     2019 0.123209 0.142457 0.145703
                                          0.143411
                                                           0.172336 0.030872
     2020 0.094556 0.142457 0.145197
                                          0.136054
                                                           0.163265
                                                                     0.026029
     2021 0.080229 0.102107 0.107378
                                          0.102074
                                                           0.095238 0.013923
     race
              White
     year
     2010 0.040647
     2011 0.046003
     2012 0.052880
     2013 0.062875
     2014 0.055564
     2015 0.067886
     2016 0.079863
     2017 0.095751
     2018 0.116855
     2019 0.144720
     2020 0.135747
     2021 0.101209
```

#### 0.2 Risk Ratios

```
[12]: # by year and state
      def rr(grp):
          year = int(grp.name)
          # state populations by race
          census = state.loc[ lambda x: x["year"] == year ]
          pop = census["total"].values[0]
          pop_black = census["black"].values[0]
          pop_white = census["white"].values[0]
          pop_hisp = census["hispanic"].values[0]
          # reg populations
          reg_total = grp["count"].sum()
          reg_black = grp.loc[
              lambda x: x["race"] == "Black"
          ]["count"].sum()
          reg_white = grp.loc[
              lambda x: x["race"] == "White"
          ]["count"].sum()
          reg_hisp = grp.loc[
              lambda x: x["race"] == "Hispanic"
          ]["count"].sum()
          # rates
          rate_white = reg_white/pop_white
          rate_black = reg_black/pop_black
          rate_hisp = reg_hisp/pop_hisp
          # risk ratios
          rrBlack = (rate_black/rate_white)
          rrHisp = rate_hisp/rate_white
          return pd.Series({
              "Risk Ratio, Black": rrBlack,
              "Risk Ratio, Hispanic": rrHisp
          })
      # Risk ratios of substantiations and established
      (
          raceYear
```

```
.loc[ lambda x: x["year"] < 2021]
          .loc[ lambda x: x["year"] > 2009]
          .groupby("year")
          .apply(rr)
      )
[12]:
            Risk Ratio, Black Risk Ratio, Hispanic
      year
      2010
                     2.008365
                                            1.273509
      2011
                     1.862071
                                            1.027717
      2012
                     1.800015
                                            1.248556
      2013
                     1.734306
                                            1.031705
      2014
                     1.837499
                                            1.174191
      2015
                     1.712210
                                            1.123856
      2016
                     1.969730
                                            1.298639
      2017
                     1.963527
                                            1.290215
      2018
                     1.878926
                                            1.169861
                     1.854315
      2019
                                            1.123383
      2020
                     1.986582
                                            1.154185
[13]: # average risk ratios
      (
          raceYear
          .loc[ lambda x: x["year"] < 2021 ]
          .loc[ lambda x: x["year"] > 2009 ]
          .groupby("year")
          .apply(rr)
          .mean()
          .to_frame("")
[13]:
      Risk Ratio, Black
                            1.873413
      Risk Ratio, Hispanic 1.174165
[14]: # county data example
          county
          .loc[
              lambda x: (x["year"] == 2019) &
              (x["county"] == "Wayne")
          ]
      )
[14]:
                      fips
                                               name
                                                       total non_hispanic
                                                                              white \
      1312  0500000US26163  Wayne County, Michigan  1757299
                                                                    1652880 870241
```

```
black native asian pac other
                                              two hispanic year
                                                                        state \
      1312 677346
                     4673 58726 426 4039 37429
                                                        104419 2019 Michigan
          county
      1312 Wayne
[15]: # risk ratios for grouping by year and county
      # helper to avoid errors
      def div(num, denom):
         if denom == 0:
             return 0
         return num/denom
      def crr(grp):
         year = int(grp.name[0])
         countyname = grp.name[1]
          # if can't locate county, it's too small for census. Skip
          census = (
             county
              .loc[ lambda x: (x["year"] == year) &
                   (x["county"] == countyname)
             ]
         )
         pop = census["total"].values[0]
         pop_black = census["black"].values[0]
         pop_white = census["white"].values[0]
         pop_hisp = census["hispanic"].values[0]
         # reg populations
         reg_total = grp["count"].sum()
         reg_black = grp.loc[
              lambda x: x["race"] == "Black"
         ]["count"].sum()
         reg_white = grp.loc[
             lambda x: x["race"] == "White"
         ]["count"].sum()
         reg_hisp = grp.loc[
             lambda x: x["race"] == "Hispanic"
         ]["count"].sum()
```

```
# rates
    rate_white = div(reg_white,pop_white)
    rate_black = div(reg_black,pop_black)
    rate_hisp = div(reg_hisp, pop_hisp)
    # risk ratios
    rrBlack = div(rate_black,rate_white)
    rrHisp = div(rate_hisp,rate_white)
    return pd.Series({
        "Total population": pop,
        "Percent black": (pop_black/pop),
        "Percent registry black": (reg_black/reg_total),
        "Risk Ratio, Black": rrBlack,
        "Risk Ratio, Hispanic": rrHisp
    })
# Risk ratios of substantiations and established
top20 = (
    raceCountyYear
    .loc[ lambda x: ~x["countyname"].str.contains(
            "\?|NO MATCH FOUND|Out-of-state")
    .loc[ lambda x: x["year"] == 2019 ]
    .groupby(["year", "countyname"])
    .apply(crr)
    .sort_values(
        ["Total population", "Risk Ratio, Black"],
        ascending = False
    ).iloc[0:20]
)
top20
```

#### [15]: Total population Percent black Percent registry black \ year countyname 1757299.0 0.385447 0.604328 2019 Wayne Oakland 1253185.0 0.135091 0.304590 Macomb 870325.0 0.116289 0.262431 Kent 648121.0 0.092261 0.273106 Genesee 407875.0 0.195403 0.316441 Washtenaw 367000.0 0.117779 0.463636 Ingham 290587.0 0.111082 0.274966 Ottawa 286558.0 0.014269 0.077748 Kalamazoo 262745.0 0.105909 0.284038 Saginaw 0.182488 0.343931 191821.0 Livingston 189754.0 0.005839 0.022388

Muskegon	173297.0	0.135011	0.233119
St. Clair	159247.0	0.021840	0.078804
Jackson	158636.0	0.076931	0.123596
Berrien	154133.0	0.145121	0.250712
Monroe	149727.0	0.023469	0.116279
Calhoun	134212.0	0.103709	0.160784
Allegan	116143.0	0.012278	0.036932
Eaton	109456.0	0.065798	0.139665
Bay	104104.0	0.016743	0.092937
·			

## Risk Ratio, Black Risk Ratio, Hispanic

year	countyname		
2019	Wayne	2.488842	1.079946
	Oakland	2.779196	1.871688
	Macomb	2.645986	0.618700
	Kent	4.188180	1.582344
	Genesee	1.980490	1.041198
	Washtenaw	6.073230	1.188149
	Ingham	3.197290	1.245436
	Ottawa	6.553983	1.840860
	Kalamazoo	3.738357	1.358339
	Saginaw	2.774734	2.063436
	Livingston	3.908918	1.247251
	Muskegon	2.040262	1.006873
	St. Clair	3.901974	0.958058
	Jackson	1.785073	0.636008
	Berrien	1.957752	0.706770
	Monroe	5.894474	1.546048
	Calhoun	1.874455	0.633549
	Allegan	3.356048	1.596449
	Eaton	2.384439	1.280461
	Bay	6.254920	1.257658

\_\_\_\_