```
import pandas as pd
 2
   import numpy as np
   import seaborn as sns
   from pathlib import Path
   from db_tools import ezfuncs
   from cod prep.downloaders import *
 6
 7
   from cod_prep.utils import *
   from cod_prep.claude.configurator import Configurator
 8
   from amr prep.utils.amr io import get amr results
9
   from amr prep.utils.amr io import AmrResult
10
11
   from mcod_prep.compile_burden import summarize_draws
12
   import warnings
   warnings.filterwarnings("ignore")
13
14
   CONF = Configurator()
15
   LSV ID = CONF.get_id('location_set_version')
16
   CSV_ID = CONF.get_id('cause_set_version')
17
18
19
   lh = get_current_location_hierarchy(location_set_version_id=LSV_ID)
    ch = get_current_cause_hierarchy(cause_set_version_id=CSV_ID)
20
21
22
23
    def get_results_wrapper(burden, measure, metric, syndrome=None,
24
                             pathogen=None, abx_class=None, draws=False,
25
                             location_id=1, counterfactual=None):
26
        df = get_amr_results(
27
            'summarize burden',
28
            burden,
29
            year_id=2019,
            cause id=294,
30
            location id=location id,
31
            age_group_id=22,
32
            infectious syndrome=syndrome,
33
            pathogen=pathogen,
34
35
            abx class=abx class,
36
            counterfactual=counterfactual,
            measure id=measure,
37
            metric_id=metric,
38
            sex id=3,
39
            hosp='all',
40
            draws=draws,
41
            filter continuously=True
42
43
44
        return df
45
46
    def print_out_cf_lower_mean_upper(df, measure):
47
48
        counterfactuals = df['counterfactual'].unique().tolist()
49
50
        for counterfactual in counterfactuals:
51
```

```
lower = df.loc[df['counterfactual'] == counterfactual, 'amr_lower'].item()
52
             mean = df.loc[df['counterfactual'] == counterfactual, 'amr_mean'].item()
53
             upper = df.loc[df['counterfactual'] == counterfactual, 'amr_upper'].item()
54
55
56
             if counterfactual == 'no_infection':
57
                 counterfactual = 'associated'
             elif counterfactual == 'susceptible_infection':
58
                 counterfactual = 'attributable'
59
60
             print(counterfactual + ' ' + measure + ': '
61
                 + str(mean) + ' (' + (str(lower) + ' - '+ str(upper)) + ')')
62
63
64
65
     def aggregate_summarize_draws(df, to_aggregate, get_pct=False, denominator=None):
66
         if isinstance(to_aggregate, str):
             to_aggregate = [to_aggregate]
67
         df.drop(columns=to_aggregate, inplace=True)
68
         non_draw_cols = [col for col in df.columns if 'draw_' not in col]
69
         draw_cols = [col for col in df.columns if 'draw_' in col]
70
71
         df = df.groupby(non_draw_cols, as_index=False)[draw_cols].sum()
72
73
         if get_pct:
74
             assert (denominator is not None), 'If you would like to calculate pct, please pass
     in denominator'
75
             denominator.drop(columns=to_aggregate, inplace=True)
76
             df = df.set_index(non_draw_cols)
             denominator = denominator.set index(non draw cols)
77
             df = df.reorder_levels(non_draw_cols)
78
             denominator = denominator.reorder_levels(non_draw_cols)
79
             assert len(df) == len(denominator)
80
81
             pct = df.div(denominator)
             pct = pct.reset_index()
82
83
84
             dfs = []
85
             for adf in [df, pct]:
                 adf = adf.reset_index()
86
                 adf = summarize_draws(adf, draw_cols=draw_cols, prefix='amr_')
87
                 adf = adf.reset_index(drop=True)
88
                 adf.loc[
89
                     adf.counterfactual == 'susceptible infection',
90
91
                     ['amr_mean', 'amr_upper', 'amr_lower']
                 ] = np.clip(adf[['amr_mean', 'amr_upper', 'amr_lower']], 0, None)
92
                 assert adf.notnull().values.all()
93
94
                 dfs.append(adf)
             return dfs[0], dfs[1]
95
96
         else:
             df = summarize draws(df, draw cols=draw cols, prefix='amr ')
97
98
             df = df.reset_index(drop=True)
             df.loc[
99
                 df.counterfactual == 'susceptible_infection',
100
                 ['amr_mean', 'amr_upper', 'amr_lower']
101
             ] = np.clip(df[['amr_mean', 'amr_upper', 'amr_lower']], 0, None)
102
103
             assert df.notnull().values.all()
104
             return df
```

```
105
106
107
108
109
     for burden in ['fatal', 'nonfatal']:
110
         print('-----' + burden.upper() + '-----')
111
112
         if burden == 'fatal':
113
             measure='Deaths'
114
            measure_id=1
         elif burden == 'nonfatal':
115
             measure='DALYs'
116
117
            measure_id=2
118
119
         print('Combo counts for fatal and nonfatal')
120
         df = get_results_wrapper(burden, measure_id, 1, syndrome='all')
121
         df = df.loc[~df['pathogen'].isin(['all', '(none_estimated)']), ]
         df = df.loc[df['abx_class'] != '(none_tested)', ]
122
         df.loc[df['pathogen'].str.contains('_escherichia'), 'pathogen'] = 'escherichia_coli'
123
124
         print(burden + ' has ' + str(len(df[['pathogen']].drop_duplicates())) + ' pathogens')
125
         print(df['pathogen'].unique().tolist())
         df = df.loc[~df['abx_class'].str.contains('all_'), ]
126
127
         print(burden + ' has ' + str(len(df[['pathogen', 'abx_class']].drop_duplicates())) + '
     combos')
128
         print(df[['pathogen', 'abx_class']].drop_duplicates())
129
130
        print()
         print('Total')
131
         df = get_results_wrapper(burden, measure_id, 1, syndrome='all', pathogen='all',
132
     abx_class='all_resistant')
133
         print('Total AMR ' + measure + ':')
134
         print_out_cf_lower_mean_upper(df, measure)
135
136
        print()
137
        print('Top 3 syndromes')
138
         df = get_results_wrapper(burden, measure_id, 1, pathogen='all',
     abx_class='all_resistant')
139
        both_cfs = []
         for counterfactual in ['no_infection', 'susceptible_infection']:
140
             print(counterfactual)
141
             print(df.loc[(df['infectious syndrome'] != 'all')
142
143
                          & (df['counterfactual'] == counterfactual),
144
                 ['infectious_syndrome', 'pathogen', 'amr_lower', 'amr_mean', 'amr_upper']]
145
                 .sort_values(by='amr_mean', ascending=False))
             top3 = df.loc[(df['infectious_syndrome'] != 'all')
146
147
                            & (df['counterfactual'] == counterfactual),
                 1.sort values(by='amr mean', ascending=False).head(3)
148
     ['infectious_syndrome'].unique().tolist()
             both_cfs.append(top3)
149
150
         assert set(both_cfs[0]) == set(both_cfs[1])
151
         df = get_results_wrapper(burden, measure_id, 1, syndrome=both_cfs[0], pathogen='all',
152
             abx_class='all_resistant', draws=True)
         total = get_results_wrapper(burden, measure_id, 1,
153
154
                                     syndrome='all', pathogen='all', abx_class='all_resistant',
```

```
155
                                      draws=True)
         df, pct = aggregate_summarize_draws(df, to_aggregate='infectious_syndrome',
156
     get_pct=True, denominator=total)
157
         print('Top 3 syndromes AMR ' + measure + ':')
158
         print_out_cf_lower_mean_upper(df, measure)
159
         print('Top 3 syndromes AMR percentage out of total ' + measure + ':')
160
         print_out_cf_lower_mean_upper(pct, measure)
161
162
         print()
163
         print('Top 6 pathogens')
164
         df = get_results_wrapper(burden, measure_id, 1, syndrome='all',
     abx_class='all_resistant')
165
         both_cfs = []
         for counterfactual in ['no_infection', 'susceptible_infection']:
166
167
             print(counterfactual)
             print(df.loc[(df['pathogen'] != 'all') & (df['counterfactual'] == counterfactual),
168
                 ['infectious_syndrome', 'pathogen', 'amr_lower', 'amr_mean', 'amr_upper']]
169
                 .sort_values(by='amr_mean', ascending=False))
170
             top6 = df.loc[(df['pathogen'] != 'all') & (df['counterfactual'] == counterfactual),
171
                 ].sort_values(by='amr_mean', ascending=False).head(6)
172
     ['pathogen'].unique().tolist()
173
             both_cfs.append(top6)
174
         df = get_results_wrapper(burden, measure_id, 1, syndrome='all', pathogen=both_cfs[0],
175
             abx_class='all_resistant', draws=True)
176
         total = get_results_wrapper(burden, measure_id, 1,
177
                                      syndrome='all', pathogen='all', abx_class='all_resistant',
178
                                      draws=True)
179
         df, pct = aggregate_summarize_draws(df, to_aggregate='pathogen', get_pct=True,
     denominator=total)
180
         print('Top 6 pathogens AMR ' + measure + ':')
181
         print_out_cf_lower_mean_upper(df, measure)
182
         print('Top 6 pathogens AMR percentage out of total ' + measure + ':')
183
         print_out_cf_lower_mean_upper(pct, measure)
184
185
         print()
         print('Top Combos')
186
         df = get_results_wrapper(burden, measure_id, 1, syndrome='all')
187
188
         both cfs = []
         for counterfactual in ['no_infection', 'susceptible_infection']:
189
190
             print(counterfactual)
191
             print(df.loc[(df['pathogen'] != 'all')
                 & (df['counterfactual'] == counterfactual)
192
193
                 & ~(df['abx_class'].str.contains('all_'))
                 & (df['abx class'] != '(none tested)'),
194
                 ['infectious_syndrome', 'pathogen', 'abx_class', 'amr_lower', 'amr_mean',
195
     'amr_upper']]
                     .sort_values(by='amr_mean', ascending=False)
196
197
                     .head(20))
198
199
         print()
200
         print('Rate By Super Regions and Regions')
         regions = lh.loc[lh['level'] <= 2, 'location_id'].unique().tolist()</pre>
201
202
         df = get_results_wrapper(burden, measure_id, 3,
             syndrome='all', pathogen=['all'],
203
```

```
204
            abx_class=['all_resistant'], location_id=regions)
        df = add location metadata(df, 'location name')
205
        df.loc[df.metric_id == 3, ['amr_mean', 'amr_lower', 'amr_upper']] = \
206
207
            df[['amr_mean', 'amr_lower', 'amr_upper']] * 100_000
208
        both_cfs = []
209
        for counterfactual in ['no_infection', 'susceptible_infection']:
210
            print(counterfactual)
211
            pd.set_option('display.max_rows', 600)
            print(df.loc[(df['counterfactual'] == counterfactual),
212
213
                ['location_name', 'infectious_syndrome', 'pathogen', 'amr_lower', 'amr_mean',
     'amr_upper']]
                    .sort_values(by='amr_mean', ascending=False))
214
215
        print()
216
217
218
    219
220
221
    print('MISC One-offs')
222
    print()
    print('Find S. Aureus, E. Coli in High-Income')
223
224
    df = get_results_wrapper('fatal', 1, 1,
        pathogen=['staphylococcus_aureus'], syndrome='all', abx_class='all_resistant',
225
    location_id=64,
226
        draws=True)
227
    total = get_results_wrapper('fatal', 1, 1,
         syndrome='all', pathogen='all', abx_class='all_resistant', location_id=64, draws=True)
228
    df, pct = aggregate_summarize_draws(df, to_aggregate='pathogen', get_pct=True,
229
    denominator=total)
230
    print('S. Aureus AMR percentage out of total in High-Income deaths:')
    print_out_cf_lower_mean_upper(pct, 'deaths')
231
232
233
234
    df = get results wrapper('fatal', 1, 1,
235
        pathogen=['escherichia coli'], syndrome='all', abx class='all resistant',
    location_id=64,
236
        draws=True)
237
    total = get results wrapper('fatal', 1, 1,
238
        syndrome='all', pathogen='all', abx_class='all_resistant', location_id=64, draws=True)
239
    df, pct = aggregate_summarize_draws(df, to_aggregate='pathogen', get_pct=True,
    denominator=total)
240
    print('E. Coli AMR percentage out of total in High-Income deaths:')
241
    print_out_cf_lower_mean_upper(pct, 'deaths')
242
243
    print()
    print('Find S. pneumoniae, K. pneumoniae in sub-Saharan Africa')
244
    df = get results wrapper('fatal', 1, 1,
245
        pathogen=['streptococcus pneumoniae'], syndrome='all', abx class='all resistant',
246
    location_id=166,
247
        draws=True)
248
    total = get results wrapper('fatal', 1, 1,
         syndrome='all', pathogen='all', abx_class='all_resistant', location_id=166, draws=True)
249
250
    df, pct = aggregate_summarize_draws(df, to_aggregate='pathogen', get_pct=True,
    denominator=total)
```

```
251
     print('S. pneumoniae AMR percentage out of total in sub-Saharan Africa deaths:')
     print out cf lower mean upper(pct, 'deaths')
252
253
254
255
    df = get_results_wrapper('fatal', 1, 1,
         pathogen=['klebsiella_pneumoniae'], syndrome='all', abx_class='all_resistant',
256
     location_id=166,
257
         draws=True)
258
     total = get_results_wrapper('fatal', 1, 1,
259
         syndrome='all', pathogen='all', abx_class='all_resistant', location_id=166, draws=True)
     df, pct = aggregate_summarize_draws(df, to_aggregate='pathogen', get_pct=True,
260
     denominator=total)
261
     print('K. pneumoniae AMR percentage deaths out of total in sub-Saharan Africa:')
     print_out_cf_lower_mean_upper(pct, 'deaths')
262
263
264
265
     print()
     print('Check that fqns and beta lactams account over 70% burden attributable')
266
267
     abxs = [
268
         'anti_pseudomonal_penicillin',
269
         'carbapenem',
270
         'fourth_gen_ceph',
271
         'third_gen_ceph',
272
         'fluoroquinolone',
         'aminopenicillin',
273
274
         'penicillin',
275
         'methicillin',
         'beta lactamase inhibitor'
276
277
     ]
278
279
     df = get_results_wrapper('fatal', 1, 1,
         syndrome='all', pathogen='all', abx class=abxs, counterfactual='susceptible infection',
280
     draws=True)
281
     print('check... ' + str(df['abx class'].unique().tolist()))
282
     total = get results wrapper('fatal', 1, 1,
         syndrome='all', pathogen='all', abx_class='all_resistant',
283
     counterfactual='susceptible_infection', draws=True)
     df, pct = aggregate_summarize_draws(df, to_aggregate='abx_class', get_pct=True,
284
     denominator=total)
     print('flqs and beta lactams total attributable deaths out of total in global:')
285
     print out cf lower mean upper(pct, 'deaths')
286
287
288
289
     overlap 4 = [
290
         'mycobacterium_tuberculosis',
         'staphylococcus aureus',
291
292
         'escherichia coli',
         'klebsiella pneumoniae'
293
294
     df = get_results_wrapper('fatal', 1, 1, syndrome='all', pathogen=overlap_4,
295
296
         counterfactual='susceptible_infection', draws=True, location_id=[42, 73])
297
     df = aggregate_summarize_draws(df, to_aggregate=['pathogen', 'abx_class', 'location_id'])
298
     print_out_cf_lower_mean_upper(df, 'deaths')
299
```

```
300
    print()
301
302
    print('Find the total burden attributable for the 11 combos that overlap with cassini')
303
304
305
     cassini overlap = [
         ['carbapenem', 'acinetobacter_baumanii'],
306
         ['vancomycin', 'enterococcus_faecalis'],
307
         ['vancomycin', 'enterococcus_faecium'],
308
         ['carbapenem', 'escherichia_coli'],
309
310
         ['third_gen_ceph', 'escherichia_coli'],
         ['carbapenem', 'klebsiella_pneumoniae'],
311
         ['third_gen_ceph', 'klebsiella_pneumoniae'],
312
         ['carbapenem', 'pseudomonas_aeruginosa'],
313
         ['methicillin', 'staphylococcus_aureus'],
314
         ['penicillin', 'streptococcus_pneumoniae'],
315
316
         ['macrolide', 'streptococcus_pneumoniae'],
317
     ]
318
319
    overlap_pathogens = [
320
         'acinetobacter baumanii',
321
         'enterococcus_faecalis',
322
         'enterococcus_faecium',
         'escherichia coli',
323
         'klebsiella_pneumoniae',
324
325
         'pseudomonas_aeruginosa',
         'staphylococcus_aureus',
326
327
         'streptococcus_pneumoniae',
328
    ]
329
    df = get_results_wrapper('fatal', 1, 1, syndrome='all', pathogen=<mark>overlap_pathogens</mark>,
330
331
         counterfactual='susceptible infection', draws=True, location id=[42, 73])
332
333
    dfs = []
334
    for combo in cassini_overlap:
         adf = df.loc[(df['abx class'] == combo[0]) & (df['pathogen'] == combo[1]), ]
335
336
         dfs.append(adf)
    df = pd.concat(dfs)
337
338
    print('Total deaths attributable for 11 combos overlap with Cassini in Central and Western
    Europe')
339
340
    df = aggregate_summarize_draws(df, to_aggregate=['pathogen', 'abx_class', 'location_id'])
    print out cf lower mean upper(df, 'deaths')
341
342
    df = get_results_wrapper('nonfatal', 2, 1, syndrome='all', pathogen=overlap_pathogens,
343
         counterfactual='susceptible infection', draws=True, location id=[42, 73])
344
345
346
    dfs = []
347
    for combo in cassini overlap:
         adf = df.loc[(df['abx_class'] == combo[0]) & (df['pathogen'] == combo[1]), ]
348
349
         dfs.append(adf)
    df = pd.concat(dfs)
350
    print('Total DALYs attributable for 11 combos overlap with Cassini in Central and Western
351
    Europe')
```

```
352
     df = aggregate_summarize_draws(df, to_aggregate=['pathogen', 'abx_class', 'location_id'])
    print_out_cf_lower_mean_upper(df, 'DALYs')
353
354
355
356
    print()
357
    print('check cardiac compared to total associated')
    df = get_results_wrapper('fatal', 1, 1, syndrome='cardiac_infectious', pathogen='all',
358
    abx_class='all_resistant',
359
        counterfactual='no_infection', draws=True)
360
    total = get_results_wrapper('fatal', 1, 1, syndrome='all', pathogen='all',
    abx_class='all_resistant',
        counterfactual='no_infection', draws=True)
361
362
    df, pct = aggregate_summarize_draws(df, to_aggregate='infectious_syndrome', get_pct=True,
    denominator=total)
363
    print_out_cf_lower_mean_upper(pct, 'deaths')
364
```