```
In [1]: import numpy as np
    from matplotlib import pyplot as plt
    import pandas as pd
    from scipy import stats as st
    import itertools as it
    from tqdm import notebook as tqdm
    from matplotlib.animation import FuncAnimation
    import random
    import multiprocessing as mp
    import modelutils
    plt.ion()
```

```
In [2]: npeople=300
ndays=21

locations = ['Bechtel','Lloyd','Page','Ruddock','Chandler']
ntrials = 5 #number of trials used to construct confidence intervals
```

Main Simulation

```
In [3]: agent_states_trials = np.zeros(shape=[ntrials,ndays,11,npeople])
        agent states nolunch trials = np.zeros(shape=[ntrials,ndays,11,npeople])
        # for trial idx in tqdm.tqdm(range(ntrials),desc='Running Simulations'):
              agent locations, agent states = modelutils.dorm simulation(ndays, lu
        nchloc='Home', lambda = 2.5e-3)
              agent locations nolunch, agent states nolunch = modelutils.dorm sim
        ulation(ndays,lunchloc='Chandler',lambda =2.5e-3)
              agent states trials[trial idx,...] = agent states
              agent states nolunch trials[trial idx,...] = agent states nolunch
        def simulation homelunch(x):
            agent locations, agent states = modelutils.dorm simulation(ndays, lunc
        hloc='Home', lambda =1e-4)
            print('finished!')
            return agent states
        def simulation chandler(x):
            agent locations, agent states = modelutils.dorm simulation(ndays,lunc
        hloc='Chandler',lambda_=1e-4)
            print('finished!')
            return agent_states
        with mp.Pool(processes=8) as pool:
            agent_states_trials= pool.map(simulation_homelunch,np.arange(ntrials
            agent states nolunch trials = pool.map(simulation chandler,np.arange
        (ntrials))
        agent states trials = np.concatenate([np.expand dims(x,axis=0) for x in
        agent states trials],axis=0)
        agent states nolunch trials = np.concatenate([np.expand dims(x,axis=0) f
        or x in agent states nolunch trials],axis=0)
```

Day: 20 / 21 finished!

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Day: 20 / 21 finished!

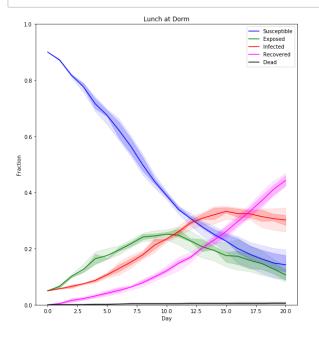
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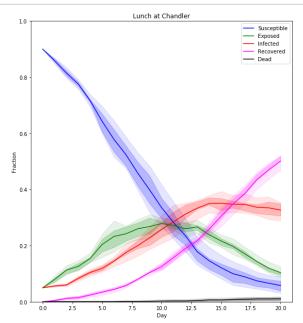
```
In [5]: agent_states_trials_sum = np.sum(agent_states_trials,axis=-1)/npeople
        agent states nolunch trials sum = np.sum(agent states nolunch trials,axi
        s=-1)/npeople
        agent states trials reduced = np.zeros([ntrials,ndays,5])
        agent states nolunch trials reduced = np.zeros([ntrials,ndays,5])
        for seir idx in range(5):
            agent states trials reduced[:,:,0] =np.sum(agent states trials sum
        [:,:,0:3],axis=-1)
            agent_states_trials_reduced[:,:,1] = np.sum(agent_states_trials_sum
        [:,:,3:6], axis=-1)
            agent_states_trials_reduced[:,:,2] = np.sum(agent_states_trials_sum
        [:,:,6:9],axis=-1)
            agent states trials reduced[:,:,3] = agent states trials sum[:,:,9]
            agent_states_trials_reduced[:,:,4] = agent_states_trials_sum[:,:,10]
            agent states nolunch trials reduced[:,:,0] =np.sum(agent states nolu
        nch trials sum[:,:,0:3],axis=-1)
            agent states_nolunch_trials_reduced[:,:,1] = np.sum(agent_states_nol
        unch_trials_sum[:,:,3:6],axis=-1)
            agent states nolunch trials reduced[:,:,2] = np.sum(agent states nol
        unch trials sum[:,:,6:9],axis=-1)
            agent_states_nolunch_trials_reduced[:,:,3] = agent_states_nolunch_tr
        ials_sum[:,:,9]
            agent states nolunch trials reduced[:,:,4] = agent states nolunch tr
        ials sum[:,:,10]
        percentiles = [10,30,90,70]
        agent states percentiles = np.zeros([len(percentiles),ndays,5])
        agent states nolunch percentiles = np.zeros([len(percentiles),ndays,5])
        for p idx in range(len(percentiles)):
            agent states percentiles[p idx,...]=np.percentile(agent states trial
        s reduced,percentiles[p idx],axis=0)
            agent states nolunch percentiles[p idx,...]=np.percentile(agent stat
        es nolunch trials reduced,percentiles[p idx],axis=0)
```

Visualization and animation code below.

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```
In [6]: alphalist = np.linspace(0.1,.3,3)
        colorlist = ['blue', 'green', 'red', 'magenta', 'black']
        time = np.arange(ndays)
        fig,ax = plt.subplots(ncols=2,figsize=[20,10])
        for plot_idx in range(len(percentiles)//2):
            for seir idx in range(5):
                ax[0].fill_between(time,agent_states_percentiles[plot_idx,:,seir
         _idx],agent_states_percentiles[plot_idx+2,:,seir_idx],color=colorlist[se
        ir idx],alpha=alphalist[plot idx])
                 ax[1].fill between(time, agent states nolunch percentiles[plot id
        x,:,seir idx],agent states nolunch percentiles[plot idx+2,:,seir idx],co
        lor=colorlist[seir idx],alpha=alphalist[plot idx])
                if plot_idx==1:
                     ax[0].plot(time,np.mean(agent_states_trials_reduced[:,:,seir
        idx],axis=0),color=colorlist[seir idx])
                     ax[1].plot(time,np.mean(agent_states_nolunch_trials_reduced)
        [:,:,seir idx],axis=0),color=colorlist[seir idx])
        ax[0].legend(['Susceptible','Exposed','Infected','Recovered','Dead'])
        ax[1].legend(['Susceptible','Exposed','Infected','Recovered','Dead'])
        ax[0].set_title('Lunch at Dorm')
        ax[1].set_title('Lunch at Chandler')
        ax[0].set xlabel('Day')
        ax[1].set_xlabel('Day')
        ax[0].set ylim([0,1])
        ax[1].set ylim([0,1])
        ax[0].set ylabel('Fraction')
        ax[1].set ylabel('Fraction')
        plt.savefig('chandler simulation FINAL.png')
```





```
In [7]: #UNCOMMENT FOR MOVEMENT DEMO
        # def draw dorm(agent locations, disease states, ax, background map = plt.i
        mread('dorms.png')):
               n n n
        #
               agent locations is a list containing the location of each agent in
        the simulation
               disease states is a list of booleans describing whether or not an
         individual is infected (0=healthy,1=infected)
              ax is the matplotlib axes object you want to draw on
              returns nothing, operates in-place
              #group together states so they're not randomly shuffled
        #
              agent locations = [x for ,x in sorted(zip(disease states, agent lo
        cations))]
              disease states = sorted(disease states)
              locations = ['Bechtel','Lloyd','Page','Ruddock','Chandler','Quaran
        tine'l
              alphaarray = np.linspace(0.25,1,num=3)
              colors=['blue','green','red']
              ax.imshow(background map)
              #add labels
              ax.text(30,75, 'Bechtel', size=14)
        #
              ax.text(215,450,'Lloyd',size=14)
              ax.text(157,450,'Page',size=14)
        #
        #
              ax.text(230,350, 'Ruddock', size=14)
        #
              ax.text(170,340,'Chandler',size=14)
        #
              ax.text(230,210, 'Quarantine', size=14)
              #each value is a 2 list describing the ranges on x and y for that
         location
              coor ranges = {
        #
        #
                   'Bechtel': [[10,100],[5,60]],
        #
                   'Lloyd': [[200,230],[377,450]],
        #
                   'Page': [[150,200],[377,450]],
                   'Ruddock': [[230,275],[360,420]],
        #
                   'Chandler': [[150,230],[340,385]],
                   'Quarantine':[[225,290],[5,200]]
        #
               }
              people counter = np.zeros(len(coor ranges.keys())).astype(np.int)
               gridlen = np.ceil(np.sqrt(len(agent locations))).astype(np.int) #c
        reate enough gridpoints such that everyone has a space if they mob a sin
        gle location (chandler)
              #iterate over people and draw each on the axis
              for person idx in range(len(agent locations)):
```

```
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          color idx = int(disease states[person idx]//3)
#
          alpha idx = int(disease states[person idx] % 3)
#
          if color idx<=2:</pre>
#
              color=colors[color idx]
#
              alpha=alphaarray[alpha idx]
#
          elif disease states[person idx]==9:
#
              color='magenta'
#
              alpha=1
#
          elif disease states[person idx]==10:
              color='black'
              alpha=1
          people counter[locations.index(agent locations[person idx])] +
= 1
          #draw a grid over the current location and place agent at spec
ified spot
          current ranges = coor ranges[agent locations[person idx]]
          xx,yy = np.meshgrid(np.linspace(current ranges[0][0],current r
anges[0][1], num=gridlen), np.linspace(current ranges[1][0], current ranges
[1][1],num=gridlen))
          #we need to convert the raw counts into row, col indices to get
the coordinates of interest
          pal = people counter[locations.index(agent locations[person id
x])]-1 #again, -1 is for indexing. pal stands for people at location
          ax.plot(xx[pal//gridlen,pal%gridlen],yy[pal//gridlen,pal%gridl
en],color=color,alpha=alpha,marker='*',markersize=10,markeredgecolor='bl
ack')
```

```
# def num2titlestr(n):
      day = n//96
#
      day rem = n % 96
      hours = day rem // 12
#
      fmt hours = 9 + hours
#
      if fmt hours>12:
#
          fmt hours+=-12
#
      fmt hours= str(fmt hours)
#
      if len(fmt hours)!=2:
#
          fmt hours = '0'+fmt hours
#
      hour rem = day rem % 12
#
      minutes = hour rem * 5
      fmt minutes = str(minutes)
```

```
if len(fmt minutes) != 2:
          fmt minutes = '0'+fmt minutes
#
      return 'Day: '+str(day)+' / '+ fmt hours+':'+fmt minutes
# fig,ax = plt.subplots(ncols=2,figsize=[20,10])
# skip=3
# ax[0].set xlabel('Timestep')
# ax[0].set ylabel('Fraction')
# ax[1].set xlabel('Timestep')
# ax[1].set ylabel('Fraction')
# def update(i,skip=skip):
      print('Step: ',i,' / ',agent locations.shape[0],end='\r')
      plot indices = np.arange(0,i,step=skip)
#
      ax[0].clear()
      ax[1].clear()
      ax[0].set title('Lunch in Dorm /'+num2titlestr(i))
      ax[1].set title('Lunch in Chandler / '+num2titlestr(i))
      disease states = np.squeeze(agent states[i//96,:,:]) #we need to
 "compress this one hot matrix (one hot along columns)"
      disease states = np.array([np.where(disease states[:,x]==1)[0]) for
x in range(disease states.shape[1])])
      disease states nolunch = np.squeeze(agent states nolunch[i//9
6,:,:]) #we need to "compress this one hot matrix (one hot along column
      disease states nolunch = np.array([np.where(disease states nolunch
[:,x]==1)[0] for x in range(disease states nolunch.shape[1])])
      draw dorm(agent locations[i,:],disease states,ax[0])
#
      draw dorm(agent locations nolunch[i,:], disease states nolunch, ax
[1])
      #ax[0].axis('off')
#
      #ax[1].axis('off')
# anim = FuncAnimation(fig, update, frames=np.arange(0,250,skip), interv
al=200, repeat delay=1000)
```

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```
# anim.save('200701_movement.gif', dpi=80, writer='imagemagick')
# print('GIF Finished!')
In [ ]:
```