

MCS Project

Cellular automata: Fire evacuation simulation

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1 Introduction

This project aims to use a simple cellular automation model presented in the paper *Cellular automaton model for evacuation process with obstacles* [1] to simulate expected behaviours and gather insights about the event of an evacuation of a room. This is done firstly in the same way as in the paper [1] to gain a baseline understanding of the model. Secondly some parameters were adjusted to get some understanding of how the model operates under different circumstances. Lastly an extension in the form of a person-to-person interaction was added to further investigate some properties and applications of the model. The cellular automata only has a few simple rules, but despite this, it does remarkably well at describing the general characteristics of an evacuation.

The model aims to simulate the real life situation of evacuating a room. This is done by dividing the room up in equally sized squares and have them all represent some aspect of the real life event. The squares are represented as doors, floor space, walls and obstacles that together makes the base upon which the simulations are carried out. The empty and walkable spaces are all indexed to replicate a field directed towards the available doors helping the simulated people move towards an exit.

2 Model selection

The model aims to replicate a room filled with pedestrians walking towards an exit. The room will be a $N \times N$ dimensional grid of pixels where each pixel represents the space taken up by one person. In [3] referenced in [1] a person in a crowded room takes up around a 0.4 meter by 0.4 meter area, each square in our model therefore also represents a 0.4m by 0.4m area in the room. Assuming the average walking speed of a person to be 1 m/s the Δt in our simulations is set to be 0.4 seconds per timestep.

2.1 Model floor

The cellular automata was simulated on a $N \times N$ grid of pixels, called the floor. The pixels are individually assigned a state depending on the timestep and defining rules of the model. There are walls, doors, obstacles and floor space. Every floor space is assigned a number depending on its location with respect to doors. A door is a floor space with the number 1 assigned to it. A wall is a floor space with the number 500 assigned to it. An obstacle, like a wall, is a floor space with the number 500 assigned to it. Every floor space can in simulations host a singular person per timestep. This, in theory, includes walls and obstacles, but as to be explained this will never happen due to the rules of the model.

Every room or instance of a simulation is started out with generating a floor. In the floor the locations of all doors and obstacles will firstly be decided upon. The algorithm will then assign numbers to every empty cell depending on its location relative to the placed doors. The generation of numbers in the floor field take obstacles and walls into account.

In [1] there were two different floor measures taken into consideration. One using distances in only two dimensions and one using euclidean distances. The two different measurements have some effect on the simulations and the differences is discussed in [1]. A conclusion drawn in that paper states that as we allow diagonal movement over cells, the most accurate measurement of movement makes use of euclidean distances. The addition of euclidean distances make a difference in for example, moving diagonally (taking one step left and one step down) compared to taking two steps in the same direction. In real life the Pythagorean theorem describes the measure of diagonal length and will be included in a simplified way. [4]

The implemented algorithm for the generation of a floor executes as following:

1. The chosen coordinates of doors are given the value 1.
2. The chosen coordinates of obstacles are given the value 500.
3. All the vertically or horizontally neighbouring floor spaces are given a value of $N + 1$.
4. All the diagonally neighbouring floor spaces are given a value of $N + \gamma$.
5. If a floor space is already assigned a value, the lowest value is chosen.
6. Starting at the doors and iterating outwards, this is repeated until all spaces are filled.
7. The walls are created around the existing floor spaces and given the values 500.

Because of our choice of euclidean distances, γ is chosen to be 1.5 which is the value used in [1] and is a great fit as the Pythagorean theorem suggest that the diagonal distance should be $\sqrt{2} \approx 1.41$.

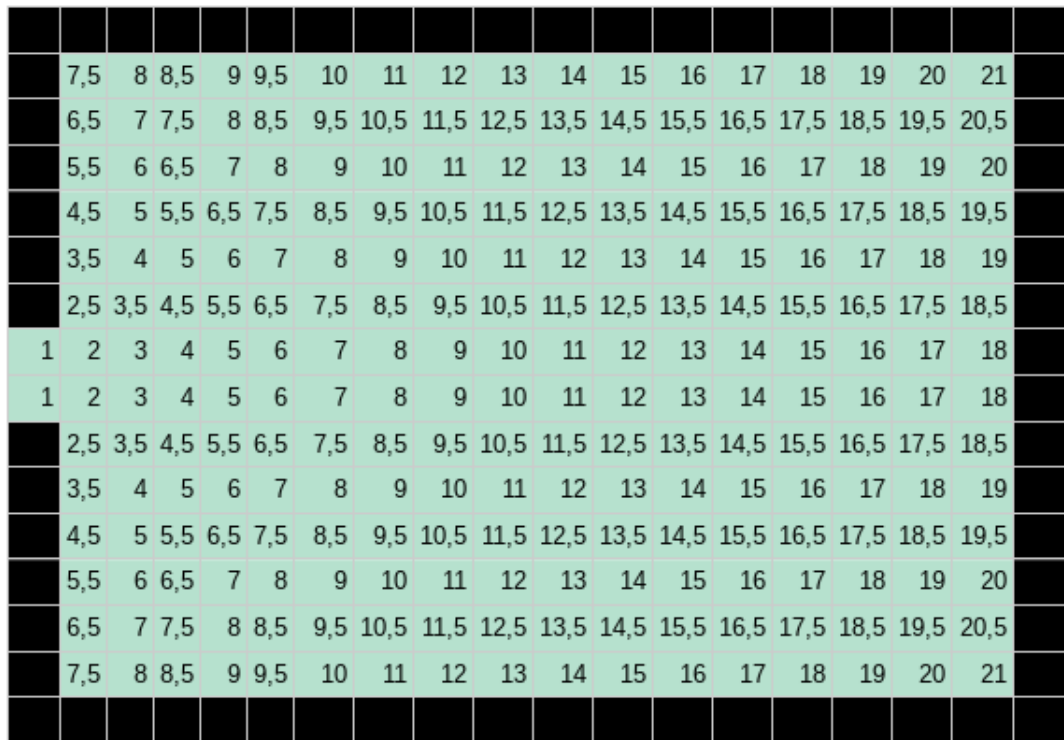


Figure 1: Standard 14 x 17 floor plan without obstacles, with floor field showing.

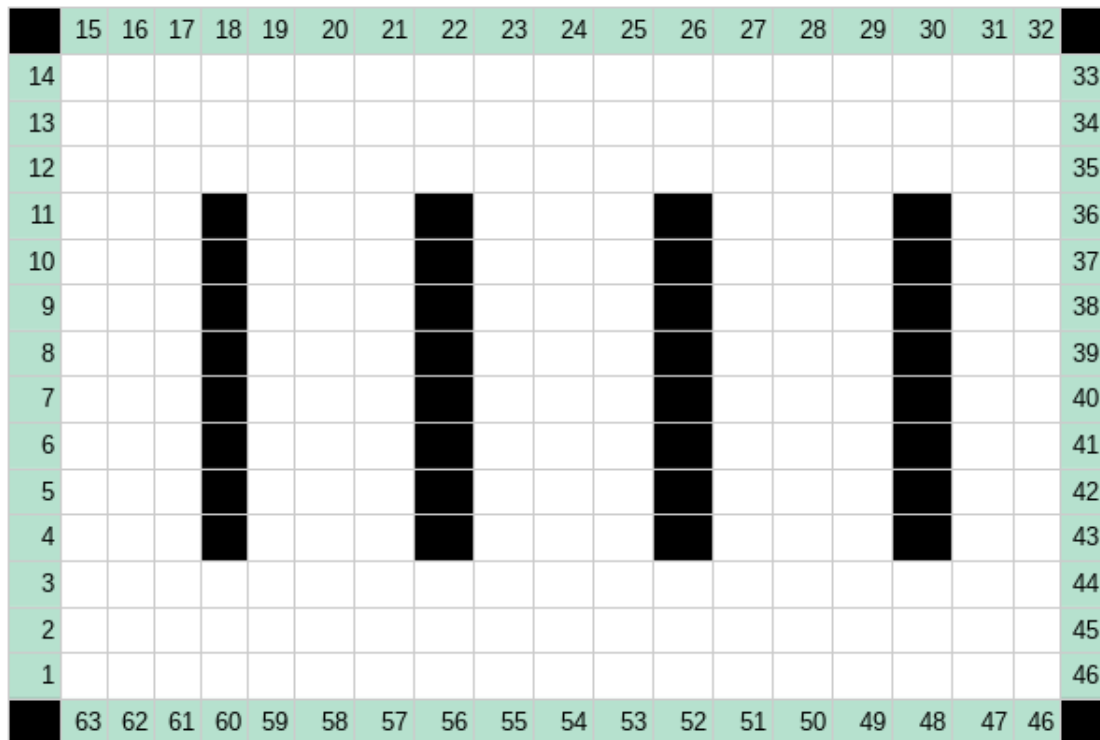


Figure 2: Standard 14 x 18 floor plan with obstacles, with door positions showing.

2.2 Model behaviour

At the start of every simulation, after the floor is generated, every empty floor space has a chance to get a person. These people follow a set of rules as in [1]. The basic rules are:

- At every iteration every person decides where to move.
- With no disturbance, a person will move to the neighbouring cell with the lowest assigned value.
- If two neighbouring cells have the same value, the choice between them is randomized.
- A person cannot move into an occupied floor space.
- If two people are trying to move into the same space two random numbers are drawn, the winner with the smallest number moves and the loser stays in the same place.
- Every person has a 5% chance to not move at all (Because of panic).

In the original paper, a panic factor was simulated by making every person have a 5% chance to not move at all. This rule will later be examined in the section *Modifying a parameter* as well as replaced and reworked in the section *Extension* where we examine panic and person-to-person interactions.

3 Simulation results

3.1 Room without obstacles

An example of a simulation can be found in *gif1.gif*.

3.2 Room with obstacles

An example of a simulation can be found in *gif2.gif*.

3.3 General findings

As seen in the previous sections, the behaviour of the model can be very easily mapped. There are a few assumptions previously made about the model that easily can be changed. For example, the current timestep Δt is set to be 0.4 seconds. If this does not match with the reality of a very similar situation the only thing needed to be changed is the assumed Δt . Other examples of simple tuning points of the model is, the rate at which people exit a door, the size taken up by every person or the speed at which a person walks in the case of an emergency. This is one of the big advantages of using a simple model like the automata used in this project.

Furthermore, we can see in *gif1.gif* that the individuals tend to group around the exit door

since there is a limit of how many individuals that can exit the room per tick. This makes the door width interesting in this case, since a wider door might enable a higher exit flow. Also in *gif2.gif*, we can see that individuals that are initially behind an obstacle that is perpendicular to a door have an significant disadvantage of escaping. This makes the door position a parameter of interest when having a dense furnished room as in *gif2.gif*, since there might be placements that are more optimal than others.

A second very obvious parameter to examine is the effect panic has on the evacuation time. Without any implemented panic the model is by definition deterministic. Any disturbances in the simulations caused by added randomness will therefore effect the evacuation times.

4 Modifying a parameter

As far as simulating a full evacuation of a room the simulations up until now serves as a good baseline. These should for maximum accuracy and relevancy be compared to actual evacuation times of similar "simple" rooms to calibrate the assumed parameters of the model, like Δt and the assumed distance between squares. The simulations in this section was performed with a 40% likelihood of any empty square to be occupied by a pedestrian. This works out to be about 100 people in total. And they were repeated 10 times for each configuration.

4.1 Results of panic parameters

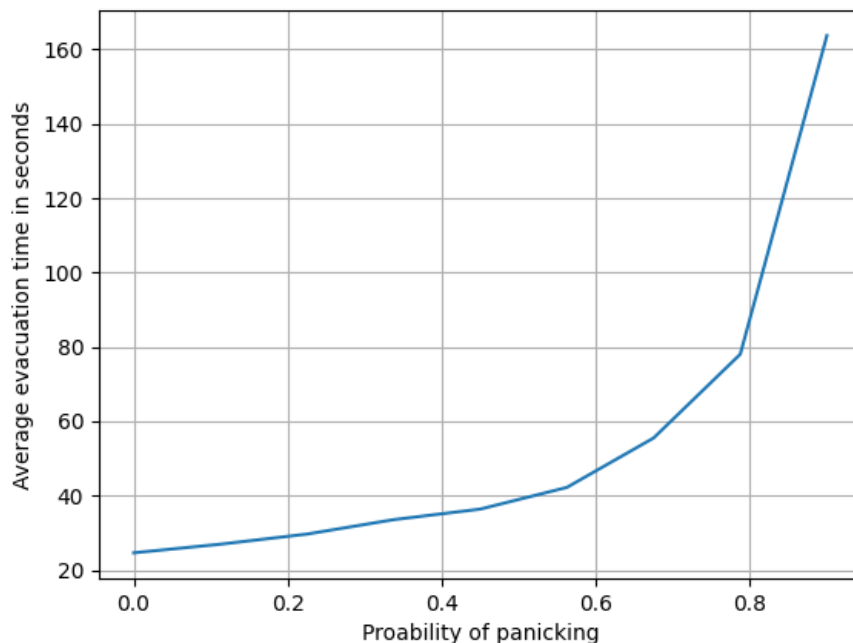


Figure 3: Average evacuation time for 100 people while varying "simple" panic parameter. Using every tick as 0.4 seconds.

4.2 Results of door width

As discussed in section 3.3, the width of the door is of interest. The door width was varied between 1 to 14 squares.

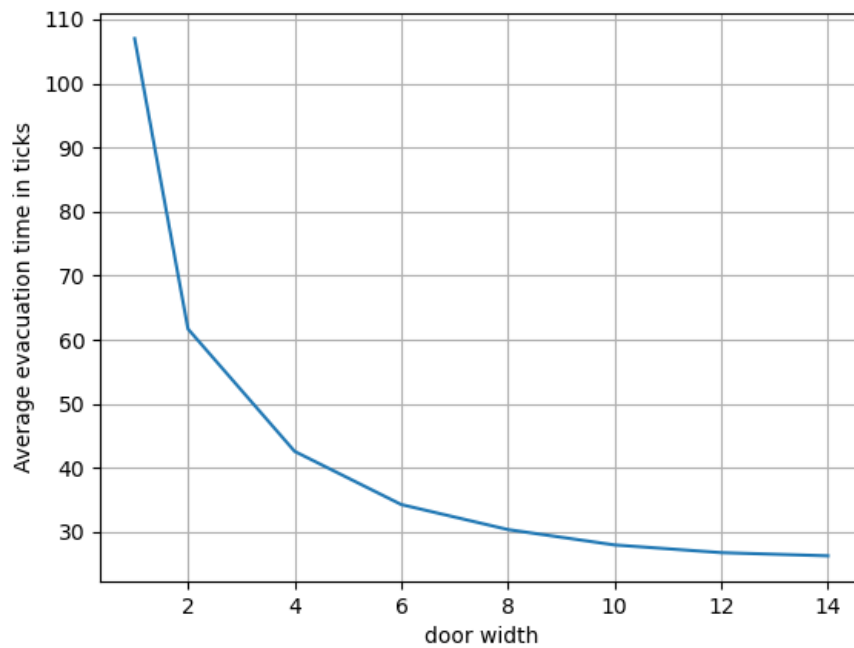


Figure 4: door width vs evacuation time

As seen in figure 4, the evacuation time seems to decrease with an decreasing door width.

4.3 Results of door position in furnished room

In this section the door position was varied as visualised in figure 2.

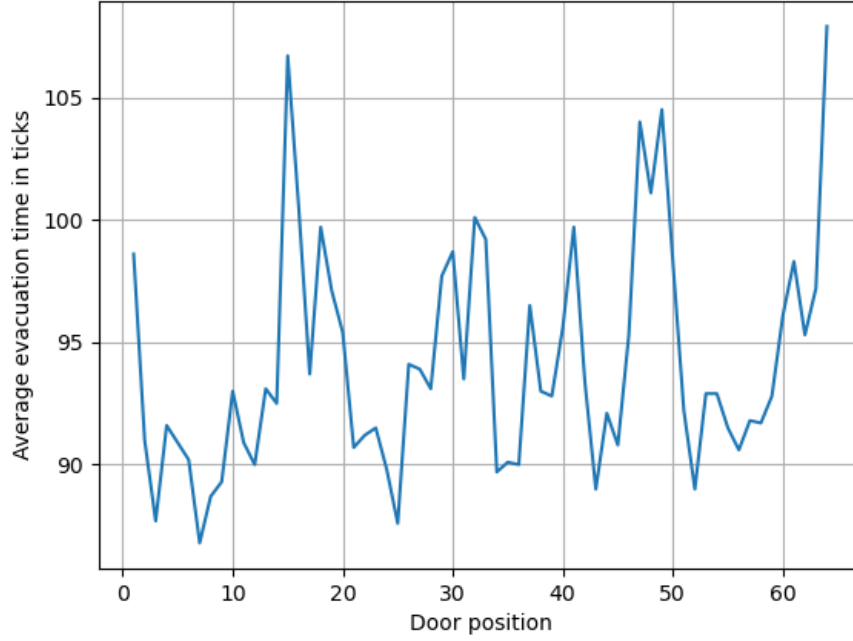


Figure 5: Result of average simulation time versus the position of the door.

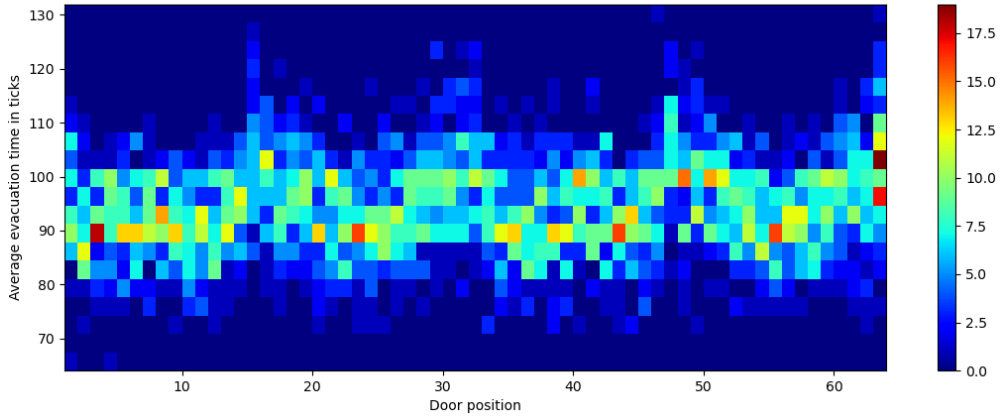


Figure 6: Phase transition plot of the actual simulation time versus the position of the door. (There is a typo on the y-label, it is the actual evacuation time, not the average.)

As seen in figure 5, the evacuation time seems to be shorter if you place the door in a central square on any wall (Number 8 and number 24 are best). This makes sense as symmetry would help the simulation to allow a more even flow of people. People might still be walking towards an unoccupied door if its placed in a bad spot which would cause time to be wasted.

5 Extension

To further examine the model a set of rules for panic was introduced. Replacing the 5% chance to not move at all, the new rules were as follows:

- Every person can have three states, *Panicking*, *Calming* or *Neutral*.
- A *panicking* person will either spread panic with a probability λ or stop panicking with a probability $1 - \lambda$.
- If a *panicking* person gets to spread panic that person will choose one neighboring person that is neutral to spread it to. And the *panicking* person continues to remain in it's position.
- If a *panicking* stops panicking, that person becomes neutral.
- A *neutral* person can only become *panicking* if a neighbouring person that's *panicking* chooses them. Otherwise they continue to moves accordingly with the rules stated in 2.2.
- A *calming* person cannot become *panicked*.
- A *calming* person will cause one panicking neighbouring person to become *neutral* in every iteration.

5.1 The impact of λ

These simulations was performed in a similar manner as in section 3.1, where the room was empty and the population was initiated in the same manner. The conditions for the different states were 50% panicking, 20 % calming and the rest were neutral. An example simulation is shown in *gif3.gif*, where the red squares are panicking individuals, green calming and blue neutral. The behaviour of the simulations for varying λ was further investigated, and the evacuation time was recorded 50 times for each parameter.

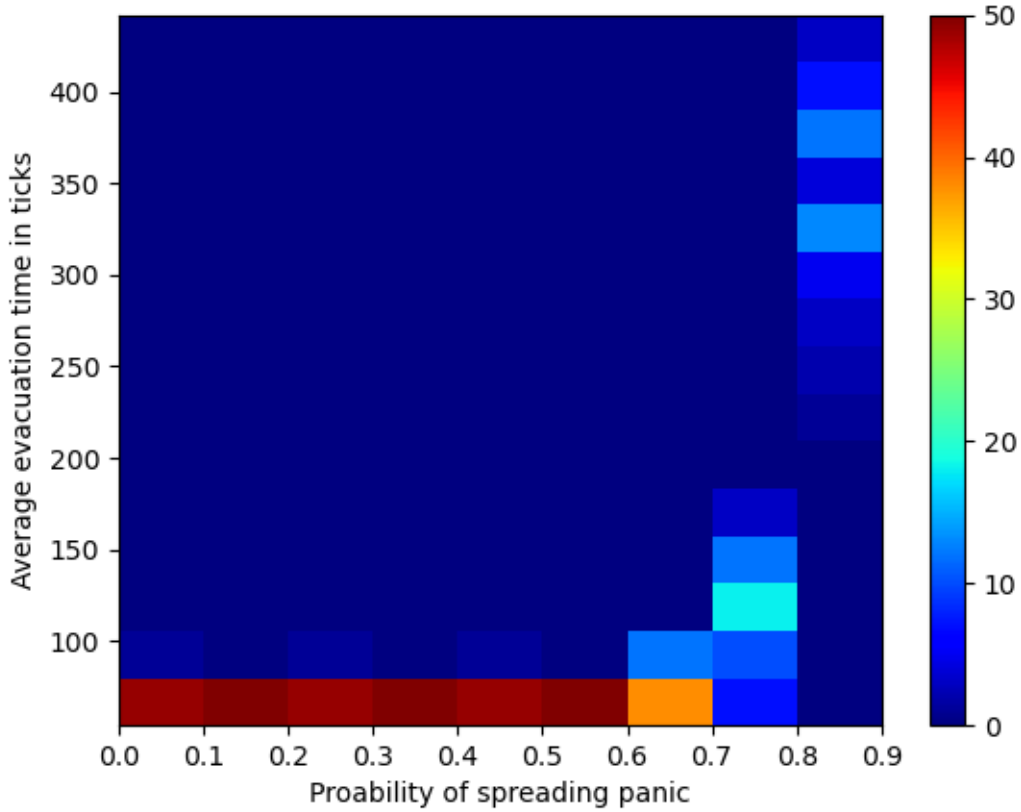


Figure 7: Phase transition plot of evacuation time and λ . (There is a typo on the y-label, it is the actual evacuation time, not the average.)

6 Conclusions

The basic model serves as an excellent baseline for a project like this, as it is very simple and have many parameters that are assumed and therefore very easy to calibrate to better make it follow real life. If a simulation is too fast the Δt can easily be changed. If a room, obstacle or door behaves too small or too large compared to reality the pixels are easily changeable and the assumed distance between them can be changed to match reality. As our project was set out to explore the model itself, the fitting to real world scenarios has not been carried out more than the initial assumptions made.

Our experiments showed very similar results to that of the original paper [1] in the initial stages of testing. Showing a very similar trend when examining the width of doors as well as the effect of obstacles and "simple" panic. The width and the position of the door seemed to have a significant impact on the result, which might be valuable knowledge if examined further. Building onto this model, adding the extension of a person-to-person interaction and expanding on the concept of panic in the model. Though this extension did not show great differences comparing to the original model. The spreading of panic increases evacuation time as seen

in figure 7 which is also hinted at by figure 3. The extension would require an improvement in order to properly model interaction with the environment as well as interactions between people. An example of this would be to implement an agent-based simulation that was discussed in *Agent-based simulation of affordance-based human behaviors in emergency evacuation* [5]. Which allows for more in depth concepts and parameters to be explored.

References

- [1] Cellular automaton model for evacuation process with obstacles, A.Varas, M.D.Cornejo, D.Mainemer, B.Toledo, J.Rogan, V.Muñoz, J.A.Valdivia. Available from: <https://www.sciencedirect.com/science/article/pii/S0378437107003676>
- [2] Cellular Automata Lecture, Fiona Skerman, Uppsala University. Available from: <https://fskerman.github.io/2022:L2.pdf>
- [3] C. Burstedde, K. Klauck, A. Schadschneider, J. Zittartz, Simulation of pedestrian dynamics using a two-dimensional cellular automaton, *Physica A* 295 (2001) 507–525.
- [4] Euclidean distance, Wikipedia, 2022-06-01. Available from: https://en.wikipedia.org/wiki/Euclidean_distance
- [5] Agent-based simulation of affordance-based human behaviors in emergency evacuation, J. Joo et al. Available from: <https://www.sciencedirect.com/science/article/pii/S1569190X12001724>

Figure Appendix

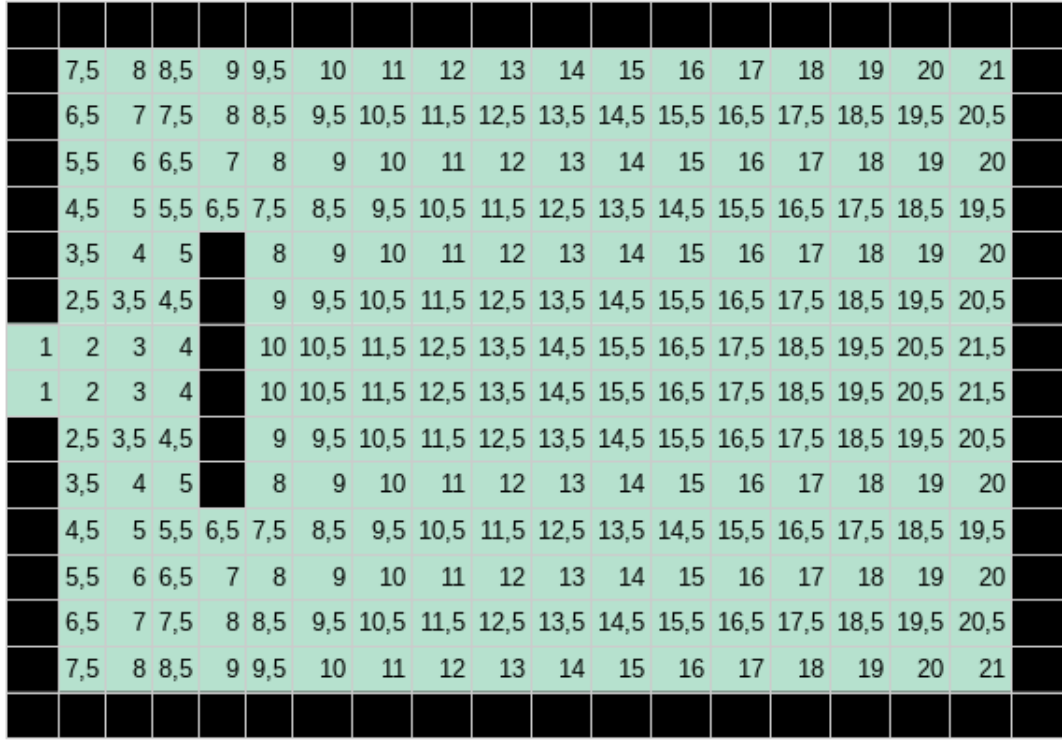


Figure 8: Standard 14 x 17 floor plan with obstacles, with floor field showing.

Code Appendix

```

1 import numpy as np
2 import matplotlib.pyplot as plt
3 import matplotlib.patches as mpatches
4 from celluloid import Camera
5 import os
6
7
8 MAIN_DIR = os.path.split(os.path.abspath(__file__))[0]
9
10
11 def set_elements_rec(mesh, row, col):
12
13     def filter_func(el, mesh = mesh):
14
15         if (el[0] < 1 or el[1] < 1 or el[0] > mesh.shape[0] - 2 or el[1] > /
16             mesh.shape[1] - 2):
17
18             return False
19
20         if (mesh[el[0],el[1]] == 1 or mesh[el[0],el[1]] == 500):
21
22             return False
23
24     return True

```

```

24
25
26     diag_ind = [(row - 1, col - 1), (row - 1, col + 1), (row + 1, col - 1), (row + /
    1, col + 1)]
27     hor_ind = [(row - 1, col), (row, col + 1), (row, col - 1), (row + 1, col)]
28     diag_ind = list(filter(filter_func, diag_ind))
29     hor_ind = list(filter(filter_func, hor_ind))
30     neighbor_ind = diag_ind + hor_ind
31     set_elements(mesh, row, col, diag_ind, lamb = 1.5)
32     set_elements(mesh, row, col, hor_ind, lamb = 1)
33
34
35
36     while True:
37
38         new_neighbours = []
39         mesh_old = mesh.copy()
40         for temprow, tempcol in neighbor_ind:
41
42             diag_ind = [(temprow - 1, tempcol - 1), (temprow - 1, tempcol + 1), /
                (temprow + 1, tempcol - 1), (temprow + 1, tempcol + 1)]
43             hor_ind = [(temprow - 1, tempcol), (temprow, tempcol + 1), (temprow, /
                tempcol - 1), (temprow + 1, tempcol)]
44
45             try:
46                 diag_ind = list(filter(filter_func, diag_ind))
47                 hor_ind = list(filter(filter_func, hor_ind))
48             except:
49                 raise ValueError(f"{{(temprow,{tempcol})}}")
50             templs = diag_ind + hor_ind
51             set_elements(mesh, temprow, tempcol, diag_ind, lamb = 1.5)
52             set_elements(mesh, temprow, tempcol, hor_ind, lamb = 1)
53
54             for tempind in templs:
55                 if tempind not in neighbor_ind and tempind not in new_neighbours:
56                     new_neighbours.append(tempind)
57
58             bool_matr = (mesh_old == mesh)
59             bool_matr = bool_matr.flatten()
60             if all(bool_matr):
61                 break
62
63             neighbor_ind = new_neighbours
64
65
66 def set_elements(mesh, row, col, indicies, lamb = 1):
67
68     for ind in indicies:
69
70         if mesh[ind[0],ind[1]] == 500:
71             continue
72         elif mesh[ind[0],ind[1]] !=0:
73             mesh[ind[0],ind[1]] = min([mesh[ind[0],ind[1]], mesh[row,col] + lamb])
74         else:
75
76             mesh[ind[0],ind[1]] = mesh[row,col] + lamb
77
78 def draw_mesh_art(rows,cols, door_pos, lamb):
79     mesh = 500 * np.ones((rows + 2), cols + 2))
80     mesh[1:rows + 1, 1:cols + 1] = 0

```

```

81
82     for i in range(4, 16 + 4, 4):
83
84         mesh[4:12,i] = 500
85
86     for door in door_pos:
87         mesh[door[0], door[1]] = 1
88
89     for ax in range(4):
90
91         doorposition_vec = np.where(mesh[:,0] == 1)[0]
92         if len(doorposition_vec) != 0:
93
94             for door in doorposition_vec:
95
96                 if mesh[door,1] != 0:
97
98                     mesh[door, 1] = min([mesh[door, 1], mesh[door, 0] + 1])
99                 else:
100                     mesh[door, 1] = mesh[door, 0] + 1
101
102                 if mesh[door + 1, 1] != 0:
103
104                     mesh[door + 1, 1] = min([mesh[door + 1, 1], mesh[door, 0] + lamb])
105                 else:
106                     mesh[door + 1, 1] = mesh[door, 0] + lamb
107
108                 if mesh[door - 1, 1] != 0:
109
110                     mesh[door - 1, 1] = min([mesh[door - 1, 1], mesh[door, 0] + lamb])
111                 else:
112                     mesh[door - 1, 1] = mesh[door, 0] + lamb
113
114
115
116                 set_elements_rec(mesh, door, 1)
117
118
119         mesh = np.rot90(mesh)
120
121     return mesh
122
123
124 def request_move(neighbourhood, people, indicies, curr_pos):
125
126     temp_neighbourhood = neighbourhood.copy()
127     temppeople = people.copy()
128
129     possible_moves = []
130     floor_val = []
131
132     for i, row in enumerate(temppeople):
133         for j, col in enumerate(row):
134             if col == 0 or indicies[i][j] == curr_pos:
135                 possible_moves.append(indicies[i][j])
136                 floor_val.append(temp_neighbourhood[i, j])
137
138     comb_list = [[dist, ind] for dist, ind in sorted(zip(floor_val, /
139     possible_moves))]
140     min_val = [comb_list[0]]

```

```

140
141     for i in range(1, len(comb_list)): # If there are several squares with the /
142         same distance.
143         if min_val[0][0] == comb_list[i][0]:
144             min_val.append(comb_list[i])
145         else:
146             break
147
148     if len(min_val) > 1: # If there are several squares with the same distance.
149
150         ind = np.random.choice(list(range(len(min_val))))
151
152         return (min_val[ind][1][0], min_val[ind][1][1])
153
154     else:
155
156         return (min_val[0][1][0], min_val[0][1][1])
157
158 def panic(prob):
159     return np.random.choice([0,1], size = 1, p = [1 - prob, prob])
160
161
162 def handle_requests(people_new, requests):
163
164     requests = sorted(requests, key = lambda x: x[1]) # Sort the requests on the /
165         destination
166
167     ind = 0
168     nr_requests = len(requests)
169
170     while ind < nr_requests:
171         temp_req_lst = [requests[ind]]
172         ind += 1
173
174
175         while ind < nr_requests and requests[ind][1] == temp_req_lst[0][1]:
176             temp_req_lst.append(requests[ind])
177
178             ind += 1
179
180
181
182     temp_num_req = len(temp_req_lst)
183     if temp_num_req > 1: # One gets to move there are several requests for one /
184         square.
185
186         rand_ind = np.random.choice(list(range(temp_num_req)))
187
188         lucky_man = temp_req_lst.pop(rand_ind)
189
190         people_new[lucky_man[1][0], lucky_man[1][1]] = 1
191         people_new[lucky_man[0][0], lucky_man[0][1]] = 0
192
193         for unlucky_man in temp_req_lst:
194
195             people_new[unlucky_man[0][0], unlucky_man[0][1]] = 1
196

```

```

197         else:
198             people_new[temp_req_lst[0][1][0], temp_req_lst[0][1][1]] = 1
199             if temp_req_lst[0][0] != temp_req_lst[0][1]:
200                 people_new[temp_req_lst[0][0][0], temp_req_lst[0][0][1]] = 0
201
202         return people_new
203
204
205
206 def step(mesh, people, panic_prob, door_pos):
207
208     requests = []
209     dims = people.shape
210     for door in door_pos:
211         people[door[0], door[1]] = 0
212
213     for i in range(1, dims[0] - 1):
214         for j in range(1, dims[1] - 1):
215
216             if people[i, j] == 0 or people[i, j] == 500:
217                 continue
218
219             if panic(panic_prob):
220                 requests.append([(i, j), (i, j)])
221
222             else:
223                 indicies = [[x, y] for y in range(j-1, j + 2)] for x in range(i-1, i /
224                                     + 2)]
225
226                 move_request = request_move(mesh[i-1:i+2, j-1:j+2], /
227                                             people[i-1:i+2, j-1:j+2], indicies, [i, j])
228                 requests.append([(i, j), move_request])
229
230
231     return handle_requests(people, requests)
232
233
234 def run_sim(mesh_dim, panic_prob, time_steps, door_pos, lamb, gen_gif = False, /
235             filename = None):
236     np.random.seed()
237
238     floor_mesh = draw_mesh_art(mesh_dim[0], mesh_dim[1], door_pos, lamb)
239     people_mesh = 500 * np.ones((mesh_dim[0] + 2, mesh_dim[1] + 2), dtype = int)
240     people_mesh[1:mesh_dim[0] + 1, 1:mesh_dim[1] + 1] = 0
241
242     for i in range(4, 16 + 4, 4):
243
244         people_mesh[4:12, i] = 500
245
246     people_mesh[people_mesh == 0] = np.random.choice([0, 1], size = /
247             people_mesh[people_mesh == 0].shape, p = [0.60, 0.40])
248
249     for door in door_pos:
250         people_mesh[door[0], door[1]] = 0
251
252     T = time_steps
253     t = 0
254     if gen_gif:
255         fig = plt.figure()

```

```

253     camera = Camera(fig)
254     plot_mesh(people_mesh, fig)
255     camera.snap()
256
257     while t < T:
258
259         people_mesh = step(floor_mesh, people_mesh, panic_prob, door_pos)
260         t += 1
261         if gen_gif:
262             plot_mesh(people_mesh, fig)
263             camera.snap()
264
265         if len(people_mesh[people_mesh == 1]) == 0:
266             break
267
268     if gen_gif:
269         animation = camera.animate()
270         animation.save(os.path.join(MAIN_DIR, 'gifs', filename))
271
272     return t
273
274
275 def plot_mesh(mesh, fig):
276     color_dict = {0: np.array([255, 255, 255]), 1: np.array([255, 0, 0]), 500: /
277                  np.array([0, 0, 0])}
278     res = [[color_dict[int(col)] for col in row] for row in mesh]
279     res = np.array(res)
280
281     if not fig:
282         plt.figure()
283
284     plt.imshow(res)
285
286     if not fig:
287         plt.show()
288
289
290
291 if __name__ == "__main__":
292
293     # case left side: increasing col from zero, divide row.
294     # case bottom: decreaseing rows from max to zero. divide columns
295     # case top: increasng rows form zero. divide cols
296     # case right: decreasing cols from zero, divide rows.
297     # door_pos = [[4,0], [2,11]]
298     # mesh = draw_mesh_art(14,18, door_pos, 1.5)
299
300
301
302     # tot_doors = [[[7,0]]]
303
304     # ind1 = 6
305     # ind2 = 9
306     # i = 1
307     # while ind1 > 0:
308     #     templist = tot_doors[i] + [[ind1, 0]] + [[ind2, 0]]
309     #     ind1 -= 1
310     #     ind2 += 1
311     #     i += 1

```



```

312     # tot_doors.append(templist)
313
314
315     tot_doors = []
316
317     for i in range(14, 0, -1):
318         tot_doors.append([i, 0])
319     for i in range(1,19):
320         tot_doors.append([0, i])
321
322     for i in range(1,15):
323         tot_doors.append([i, 19])
324
325     for i in range(18,0, -1):
326         tot_doors.append([15, i])
327
328
329
330     # panic_prob_vec = np.linspace(0, 0.9, 9)
331     panic_prob_vec = [0.05]
332     num_rep = 10
333     filename = 'example_furnished3.gif'
334     evac_time_vec = []
335
336     for doors in tot_doors:
337         tempvec = []
338         for i in range(num_rep):
339             evacuation_time = run_sim((14,18), panic_prob_vec[0], 2000, doors, 1.5)
340             tempvec.append(evacuation_time)
341             evac_time_vec.append(np.mean(tempvec))
342
343     # evacuation_time = run_sim((14,18), panic_prob_vec[0], 500, [[7,0], [7,19]], /
344         1.5, True, filename)
345
346     dor = np.array(list(range(len(evac_time_vec)))) + 1
347
348     plt.figure()
349     plt.plot(dor, evac_time_vec)
350     plt.xlabel('Door_position')
351     plt.ylabel('Average_evacuation_time_in_ticks')
352     plt.grid(True)
353     plt.show()

```

Listing 1: The code for the first model.

```

1 import numpy as np
2 import matplotlib.pyplot as plt
3 import matplotlib.patches as mpatches
4 from celluloid import Camera
5 import os
6
7 MAIN_DIR = os.path.split(os.path.abspath(__file__))[0]
8 color_dict = {0: np.array([255, 255, 255]), 500: np.array([0, 0, 0])}
9 state_dict = {0: np.array([0, 0, 255]), 1: np.array([255, 0, 0]), 2: np.array([0, /
10     255, 0])}
11
12 class person:
13     def __init__(self, pos, state):
14         self.pos = pos
15         self.state = state

```

```

16
17
18 def set_elements_rec(mesh, row, col):
19
20     def filter_func(el, mesh = mesh):
21
22         if (el[0] < 1 or el[1] < 1 or el[0] > mesh.shape[0] - 2 or el[1] > /
23             mesh.shape[1] - 2):
24
25             return False
26
27         if (mesh[el[0],el[1]] == 1 or mesh[el[0],el[1]] == 500):
28
29             return False
30
31         return True
32
33     diag_ind = [(row - 1, col - 1), (row - 1, col + 1), (row + 1, col - 1), (row + /
34         1, col + 1)]
35     hor_ind = [(row - 1, col), (row, col + 1), (row, col - 1), (row + 1, col)]
36     diag_ind = list(filter(filter_func, diag_ind))
37     hor_ind = list(filter(filter_func, hor_ind))
38     neighbor_ind = diag_ind + hor_ind
39     set_elements(mesh, row, col, diag_ind, lamb = 1.5)
40     set_elements(mesh, row, col, hor_ind, lamb = 1)
41
42
43     while True:
44
45         new_neighbours = []
46         mesh_old = mesh.copy()
47         for temprow, tempcol in neighbor_ind:
48
49             diag_ind = [(temprow - 1, tempcol - 1), (temprow - 1, tempcol + 1), /
50                 (temprow + 1, tempcol - 1), (temprow + 1, tempcol + 1)]
51             hor_ind = [(temprow - 1, tempcol), (temprow, tempcol + 1), (temprow, /
52                 tempcol - 1), (temprow + 1, tempcol)]
53
54             diag_ind = list(filter(filter_func, diag_ind))
55             hor_ind = list(filter(filter_func, hor_ind))
56             templs = diag_ind + hor_ind
57             set_elements(mesh, temprow, tempcol, diag_ind, lamb = 1.5)
58             set_elements(mesh, temprow, tempcol, hor_ind, lamb = 1)
59
60             for tempind in templs:
61                 if tempind not in neighbor_ind and tempind not in new_neighbours:
62                     new_neighbours.append(tempind)
63
64         bool_matr = (mesh_old == mesh)
65         bool_matr = bool_matr.flatten()
66         if all(bool_matr):
67             break
68
69         neighbor_ind = new_neighbours
70
71 def set_elements(mesh, row, col, indicies, lamb = 1):

```

```

72     for ind in indicies:
73
74         if mesh[ind[0],ind[1]] == 500:
75             continue
76         elif mesh[ind[0],ind[1]] !=0:
77             mesh[ind[0],ind[1]] = min([mesh[ind[0],ind[1]], mesh[row,col] + lamb])
78         else:
79
80             mesh[ind[0],ind[1]] = mesh[row,col] + lamb
81
82 def draw_mesh_art(rows,cols, door_pos, lamb):
83     mesh = 500 * np.ones((rows + 2), cols + 2))
84     mesh[1:rows + 1, 1:cols + 1] = 0
85
86     for i in range(4, 16 + 4, 4):
87
88         mesh[4:12,i] = 500
89
90
91     for door in door_pos:
92         mesh[door[0], door[1]] = 1
93
94     for ax in range(4):
95
96         doorposition_vec = np.where(mesh[:,0] == 1)[0]
97         if len(doorposition_vec) != 0:
98
99             for door in doorposition_vec:
100
101                 if mesh[door,1] != 0:
102
103                     mesh[door, 1] = min([mesh[door, 1], mesh[door, 0] + 1])
104                 else:
105                     mesh[door, 1] = mesh[door, 0] + 1
106
107                 if mesh[door + 1, 1] != 0:
108
109                     mesh[door + 1, 1] = min([mesh[door + 1, 1], mesh[door, 0] + lamb])
110                 else:
111                     mesh[door + 1, 1] = mesh[door, 0] + lamb
112
113                 if mesh[door - 1, 1] != 0:
114
115                     mesh[door - 1, 1] = min([mesh[door - 1, 1], mesh[door, 0] + lamb])
116                 else:
117                     mesh[door - 1, 1] = mesh[door, 0] + lamb
118
119
120
121                 set_elements_rec(mesh, door, 1)
122
123
124     mesh = np.rot90(mesh)
125
126     return mesh
127
128 def request_move(neighbourhood, people, indicies, curr_pos):
129
130     temp_neighbourhood = neighbourhood.copy()
131     temppeople = people.copy()

```

```

132
133 possible_moves = []
134 floor_val = []
135
136 for i, row in enumerate(temppeople):
137     for j, col in enumerate(row):
138         if col == 0 or indicies[i][j] == curr_pos:
139             possible_moves.append(indicies[i][j])
140             floor_val.append(temp_neighbourhood[i, j])
141
142 comb_list = [[dist, ind] for dist, ind in sorted(zip(floor_val, /
143 possible_moves))]
144 min_val = [comb_list[0]]
145
146 for i in range(1, len(comb_list)): # If there are several squares with the /
147     same distance.
148     if min_val[0][0] == comb_list[i][0]:
149         min_val.append(comb_list[i])
150     else:
151         break
152
153 if len(min_val) > 1: # If there are several squares with the same distance.
154     ind = np.random.choice(list(range(len(min_val))))
155
156     return (min_val[ind][1][0], min_val[ind][1][1])
157
158 else:
159     return (min_val[0][1][0], min_val[0][1][1])
160
161 def panic(prob):
162     return np.random.choice([0,1], size = 1, p = [1 - prob, prob])
163
164
165 def handle_requests(people_new, requests, person_vec):
166
167     requests = sorted(requests, key = lambda x: x[1]) # Sort the requests on the /
168     destination
169
170     ind = 0
171     nr_requests = len(requests)
172
173
174     while ind < nr_requests:
175         temp_req_lst = [requests[ind]]
176         ind += 1
177
178
179         while ind < nr_requests and requests[ind][1] == temp_req_lst[0][1]:
180             temp_req_lst.append(requests[ind])
181
182             ind += 1
183
184
185
186     temp_num_req = len(temp_req_lst)
187     if temp_num_req > 1: # One gets to move there are several requests for one /
188         square.

```

```

188
189     rand_ind = np.random.choice(list(range(temp_num_req)))
190
191     lucky_man = temp_req_lst.pop(rand_ind)
192
193     people_new[lucky_man[1][0], lucky_man[1][1]] = 1
194     people_new[lucky_man[0][0], lucky_man[0][1]] = 0
195     temp_ind = find_person_at(person_vec, lucky_man[0])
196     person_vec[temp_ind].pos = lucky_man[1]
197
198
199     for unlucky_man in temp_req_lst:
200
201         people_new[unlucky_man[0][0], unlucky_man[0][1]] = 1
202
203     else:
204         people_new[temp_req_lst[0][1][0], temp_req_lst[0][1][1]] = 1
205         if temp_req_lst[0][0] != temp_req_lst[0][1]:
206             temp_ind = find_person_at(person_vec, temp_req_lst[0][0])
207             person_vec[temp_ind].pos = temp_req_lst[0][1]
208             people_new[temp_req_lst[0][0][0], temp_req_lst[0][0][1]] = 0
209
210     return people_new, person_vec
211
212
213 def find_person_at(person_vec, pos):
214
215     for i, person in enumerate(person_vec):
216         if person.pos == pos:
217             return i
218
219 def step(mesh, people, panic_spread_prob, door_pos, person_vec):
220
221     requests = []
222     state_update_vec = []
223     dims = people.shape
224     for door in door_pos:
225         people[door[0], door[1]] = 0
226
227     num_persons = len(person_vec)
228
229     pind = num_persons - 1
230
231     while pind > 0:
232         temppos = person_vec[pind].pos
233
234         if [temppos[0], temppos[1]] in door_pos:
235             person_vec.pop(pind)
236
237         pind -= 1
238
239     for i in range(1, dims[0] - 1):
240         for j in range(1, dims[1] - 1):
241
242             if people[i, j] == 0:
243                 continue
244
245             p_ind = find_person_at(person_vec, (i,j))
246             indicies = [[x,y] for y in range(j-1, j + 2)] for x in range(i-1, i + /
247                        2)]

```

```

247     if person_vec[p_ind].state == 1:
248
249         requests.append([(i,j), (i,j)])
250         if panic(panic_spead_prob):
251
252             possible_moves = []
253
254             for indx in indicies:
255                 for indy in indx:
256                     if people[indy[0],indy[1]] != 500 and /
257                         people[indy[0],indy[1]] != 0 and indy != [i,j]:
258
259                             possible_moves.append(indy)
260
261             if len(possible_moves) > 0:
262                 tempind = np.random.choice(list(range(len(possible_moves))))
263                 spread = possible_moves[tempind]
264                 state_update_vec.append([(spread[0], spread[1]), 1])
265             else:
266                 state_update_vec.append([(i, j), 0])
267
268     else:
269
270         if person_vec[p_ind].state == 2:
271
272             possible_moves = []
273
274             for indx in indicies:
275                 for indy in indx:
276                     if people[indy[0],indy[1]] != 500 and /
277                         people[indy[0],indy[1]] != 0 and indy != [i,j]:
278
279                             possible_moves.append(indy)
280
281             if len(possible_moves) > 0:
282                 tempind = np.random.choice(list(range(len(possible_moves))))
283                 calm = possible_moves[tempind]
284                 state_update_vec.append([(calm[0], calm[1]), 0])
285
286
287             move_request = request_move(mesh[i-1:i+2,j-1:j+2], /
288                 people[i-1:i+2,j-1:j+2], indicies, [i,j])
289             requests.append([(i,j), move_request])
290
291 for pos, status in state_update_vec:
292
293     p_ind = find_person_at(person_vec, pos)
294
295     if person_vec[p_ind].state != 2:
296
297         person_vec[p_ind].state = status
298
299 return handle_requests(people, requests, person_vec)
300
301
302 def run_sim(mesh_dim, panic_prob, time_steps, door_pos,lamb, init_panic, /
303     init_calm, gen_gif = False, filename = None):

```

```

303     np.random.seed()
304
305     floor_mesh = draw_mesh_art(mesh_dim[0], mesh_dim[1], door_pos, lamb)
306     people_mesh = 500 * np.ones((mesh_dim[0] + 2, mesh_dim[1] + 2), dtype = int)
307
308     for door in door_pos:
309         people_mesh[door[0], door[1]] = 0
310
311     people_mesh_c = people_mesh.copy()
312     people_mesh_c[1:mesh_dim[0] + 1, 1:mesh_dim[1] + 1] = 0
313
314     people_mesh[1:mesh_dim[0] + 1, 1:mesh_dim[1] + 1] = np.random.choice([0,1], /
315         size = mesh_dim, p = [0.60,0.40])
316     indx,indy = np.where(people_mesh == 1)
317     people_indices = np.concatenate((indx.reshape(-1,1),indy.reshape(-1,1)), axis /
318         = 1)
319
320     person_vec = []
321
322     for ind in people_indices:
323         state = np.random.choice([0,1,2], p = [1 - init_panic - init_calm, /
324             init_panic, init_calm])
325         person_vec.append(person((ind[0], ind[1]), state))
326
327     T = time_steps
328     t = 0
329     if gen_gif:
330         fig = plt.figure()
331         camera = Camera(fig)
332         plot_mesh(people_mesh_c, person_vec, fig)
333         camera.snap()
334
335     while t < T:
336
337         people_mesh, person_vec = step(floor_mesh, people_mesh, panic_prob, /
338             door_pos, person_vec)
339         t += 1
340         if gen_gif:
341             plot_mesh(people_mesh_c, person_vec, fig)
342             camera.snap()
343
344         if len(people_mesh[people_mesh == 1]) == 0:
345             break
346
347     if gen_gif:
348         animation = camera.animate()
349         animation.save(os.path.join(MAIN_DIR, 'gifs', filename))
350
351     return t
352
353 def plot_mesh(mesh, person_vec, fig):
354
355     res = [[color_dict[int(col)] for col in row] for row in mesh]
356     res = np.array(res)
357
358     for person in person_vec:
359         temppos = person.pos

```

```

359     res[temppos[0], temppos[1]] = state_dict[person.state]
360
361
362     if not fig:
363         plt.figure()
364
365     plt.imshow(res)
366
367     if not fig:
368         plt.show()
369
370
371
372
373 if __name__ == "__main__":
374
375     # case left side: increasing col from zero, divide row.
376     # case bottom: decreaseing rows from max to zero. divide columns
377     # case top: increasng rows form zero. divide cols
378     # case right: decreasing cols from zero, divide rows.
379     # door_pos = [[4,0], [2,11]]
380     # mesh = draw_mesh_art(14,18, door_pos, 1.5)
381
382
383     door_pos = [[8,0], [7,0]]
384     num_rep = 50
385     filename = 'sim3.gif'
386     evac_time_vec = []
387     panic_prob_vec = np.linspace(0, 0.9, 9)
388     init_panic = 0.5
389     init_calm = 0.2
390     # evacuation_time = run_sim((14,18), panic_spread, 300, door_pos, 1.5, /
391         init_panic, init_calm, True, filename)
392
393
394     for freeze_prob in panic_prob_vec:
395         tempvec = []
396         for i in range(num_rep):
397             evacuation_time = run_sim((14,18), freeze_prob, 2000, door_pos, 1.5, /
398                 init_panic, init_calm)
399             evac_time_vec.append([freeze_prob, evacuation_time])
400
401     # plt.figure()
402     # plt.plot(panic_prob_vec, evac_time_vec)
403     plt.show()
404     tot_res = np.array(evac_time_vec)
405     plt.hist2d(tot_res[:,0], tot_res[:,1], bins=(9,15), cmap=plt.cm.jet)
406     plt.ylabel("Average_evacuation_time_in_ticks")
407     plt.xlabel("Proability_of_spreading_panic")
408     plt.colorbar()
409     plt.show()

```

Listing 2: The code for the extended model.