


**THE SIXTH SMART CITY APPLICATIONS INTERNATIONAL CONFERENCE**

**Agent-Based Model for Analyzing COVID-19 Infection in the Campus Using AnyLogic Software**

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**Outline**

- Introduction
- Problem Statement
- Literature Review
- Research Methodology
- Results and Analysis
- Conclusion and Recommendations
- References



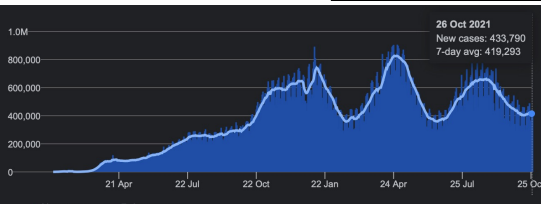
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**INTRODUCTION**

- Coronavirus disease 2019 (COVID-19) is a fatal global pandemic that caused by severe acute respiratory syndrome coronavirus.

Until 26th Oct 2021  
 Global: 245 million cases

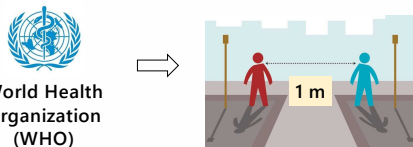


Source: ourworldindata.org (2021)


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World Health Organization (WHO)



- ~ 92% of cases will be lowered if the proper social distancing practices are conducted (Prem et al., 2020).

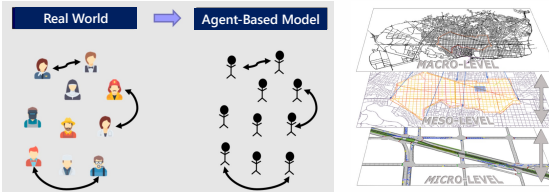


Source: JHU CSSE (2021)

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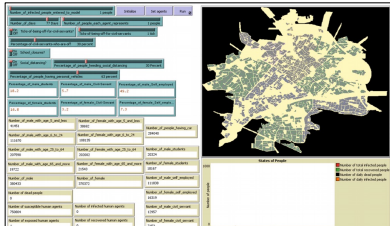
- Computational models like **Agent-Based Modelling (ABM)** can be used to analyze diseases spread in terms of geographical and demographic aspects .



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**EXAMPLE 1 - Macro Level**



**ABM model for Urmia city, Iran**  
 Developer: Gharakhanlou and Hooshangi (2020)

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**EXAMPLE 2 - Meso Level**

ABM model for small town in rural Canadian municipality  
Developer: Luminesim (2020)

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**EXAMPLE 3 - Micro Level**

Office ABM model  
Developer: Accenture (2020)

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**PROBLEM STATEMENT**

83 COVID-19 clusters

1<sup>st</sup> January 2021 to 21<sup>st</sup> April 2021

**Reasons Difficult To Practise Social Distancing**

May offend other people when practice Social Distance	22.4%
Nature of occupation that requires interaction	34.5%
Keep forgetting to maintain distance	36.8%
Not practical to practice (choosing items in supermarkets/elsewhere)	41.5%
People around me don't practice it	62.7%
Limited space in building/location/transport	76.2%

Source: Perialathan et al. (2020)

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Students will come back campus for conducting academic works

**Aim of the Study:**  
To model and analyze the COVID-19 infection inside the campus using ABM

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**LITERATURE REVIEW**

**INFECTION FACTORS OF COVID-19**

Social Distance      Ventilation      Exposure Time

(Burridge et al., 2021; Jones et al., 2020; Sun and Zhai, 2020)

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**1<sup>st</sup> Factor: Social Distance**

Country	Social Distancing Rule
China	More than 1 m
Malaysia	At least 1 m
South Africa	At least 1 m
Australia	Keep 1.5 m
Japan	At least 1.8 m
Brazil	At least 2 m
Canada	At least 2 m
United Kingdom	At least 2 m
United State	Maintain 2 m

Source: Xie et al. (2020)      Source: Chu et al. (2020)

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### 2<sup>nd</sup> Factor: Ventilation

**Modified Wells-Riley Model (Sun and Zhai, 2020)**

$$P_I = 1 - \exp\left(-P_d \frac{Bqpt}{E_z \cdot Q/N}\right)$$

Social distance probability →  $P_d$   
 Exposure time →  $t$   
 Effectiveness of ventilation factor →  $E_z$   
 Probability of infectious risk →  $P_I$

**Minimum Ventilation Rate Requirement based on ASHRAE (ASHRAE, 2019)**

Occupancy Category	Ventilation Rate (L/s/person)
Lecture Classroom	3.8
Office Space	2.5
University/College Laboratories	5

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### 3<sup>rd</sup> Factor: Exposure Time

>=15 minutes

Close Contact (CDC, 2021)

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### RESEARCH METHODOLOGY

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### Study Area

Block C02, FABU, UTM

Floor Level	Room Type	Room Name
1	Laboratory	GIS Lab 2
2	Administrator Office	Postgraduate Office - Reception Area
4	Lecture Room	Lecture Room 2

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#### Data Source

Data Types	Source
FABU Room Shapefile	PHB UTM
FABU Room Interior Layout	PHB UTM
Number of Students	FABU UTM
Number of FABU Staffs	FABU UTM

#### Software

**anylogic**  
Personal Learning Edition  
Version 8.7

#### Scenarios

- Laboratory
- Lecture Room
- Postgraduate Office (Reception Area)

#### Students (Agents)

enter → Study Area (cool air environment)

Social distance: • 1 m, 1.5 m, 1.8 m, 2 m

Exposure time: • 10 min

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### CONCEPTUAL DESIGN OF ABM MODEL

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### DEVELOPMENT OF ABM MODEL IN ANYLOGIC

#### Agent State - Statechart

$$t = \frac{\ln(1 - P_i) \cdot E_z \cdot Q/N}{P_d \cdot Bqp}$$

Time taken for becoming infectious

Susceptible Exposed Infectious

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### DEVELOPMENT OF ABM MODEL IN ANYLOGIC

#### Agent's Behaviors - Pedestrian Library

Simulate the movement of agents to enter the room and stay in the seats

pedSource1 pedSelectOutput1 pedService pedGoIo1 pedSink5  
 pedService1 pedGoIo21 pedSink6  
 pedService2 pedGoIo25 pedSink7  
 pedService3 pedGoIo27 pedSink8  
 pedService4 pedGoIo29 pedSink9

pedSource1 - PedSource  
 Limited number of arrivals: [checkbox] [value]  
 Maximum number of arrivals: [checkbox] [value]

pedService - PedService  
 Delay time: [value]  
 TimeOfContact: [value] minutes

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### INPUT INTERFACE

#### COVID-19 Agent-Based Model in GIS Lab 2, FABU UTM

Location: Block C02 Level 1

Number of People: [slider] 30  
 Fraction Initially Infected: [slider] 0.2 (To define the initial number of infected people)  
 Social Distance: [slider] 1.8 m  
 Time of Contact: [slider] 30 minutes  
 Probability of Infection: [slider] 0.02 (value between 0-1)

Author: Gan Wei Xin  
 Supervisor: Dr. Shahabuddin bin Amerudin  
 Master Project: Simulation and Analysis of COVID-19 Infection Using Agent Based Modelling Based on Social Distance  
 Year: June 2021

Setup Parameter

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### Analysis Parameter

#### COVID-19 Agent-Based Model in GIS Lab 2, FABU UTM

Location: Block C02 Level 1

Number of People: [slider] 25 people  
 Fraction Initially Infected: [slider] 0.2 (To define the initial number of infected people)  
 Social Distance: [slider] 1.8 m, 1.5 m, 1.8 m and 2.0 m  
 Time of Contact: [slider] 30 minutes, 10 min  
 Probability of Infection: [slider] 0.02 (value between 0-1), 2% infection risk

Author: Gan Wei Xin  
 Supervisor: Dr. Shahabuddin bin Amerudin  
 Master Project: Simulation and Analysis of COVID-19 Infection Using Agent Based Modelling Based on Social Distance

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### RESULT INTERFACE

Initial Simulation      Simulation after 5 minutes      Simulation after 10 minutes

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### COMPARISON OF THE ANALYSIS

Percentage of New Added Infected and Non-Infected People with 10 minutes Exposure Time

• New Infected • Non-Infected

Social Distance	Area	New Infected (%)	Non-Infected (%)
1.0 m	Postgraduate Office (Reception Area)	69%	31%
	Lecture Room 2	65%	35%
	GIS Lab 2	70%	30%
1.5 m	Postgraduate Office (Reception Area)	69%	31%
	Lecture Room 2	21%	79%
	GIS Lab 2	9%	91%
1.8 m	Postgraduate Office (Reception Area)	77%	23%
	Lecture Room 2	81%	19%
	GIS Lab 2	100%	0%
2.0 m	Postgraduate Office (Reception Area)	80%	20%
	Lecture Room 2	80%	20%
	GIS Lab 2	100%	0%

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**CONCLUSION**

- ABM is a technique that can simulate and analyze the phenomenon of the COVID-19 spread in the indoor environment.
- Social distance is a guideline for administrator to arrange the capacity of the room.
- ABM models can give the awareness to the administrators and students.

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**RECOMMENDATIONS**

- 1 Larger extent that covered the rooms for all buildings in the campus in 2D and 3D model
- 2 Add new parameters:
  - Room size (dimension)
  - Seat arrangement
- 3 Time of contact in the rooms when all of the susceptible agents will get infected

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