



# Advanced Modeling for Operations 23/24

## *ASSIGNMENT - PART 1*



**POLITECNICO**  
MILANO 1863

DIPARTIMENTO DI  
INGEGNERIA GESTIONALE

# Course organisation

## Assessment

The **exam** includes:

- **Group assignment**



**70%** of the final mark

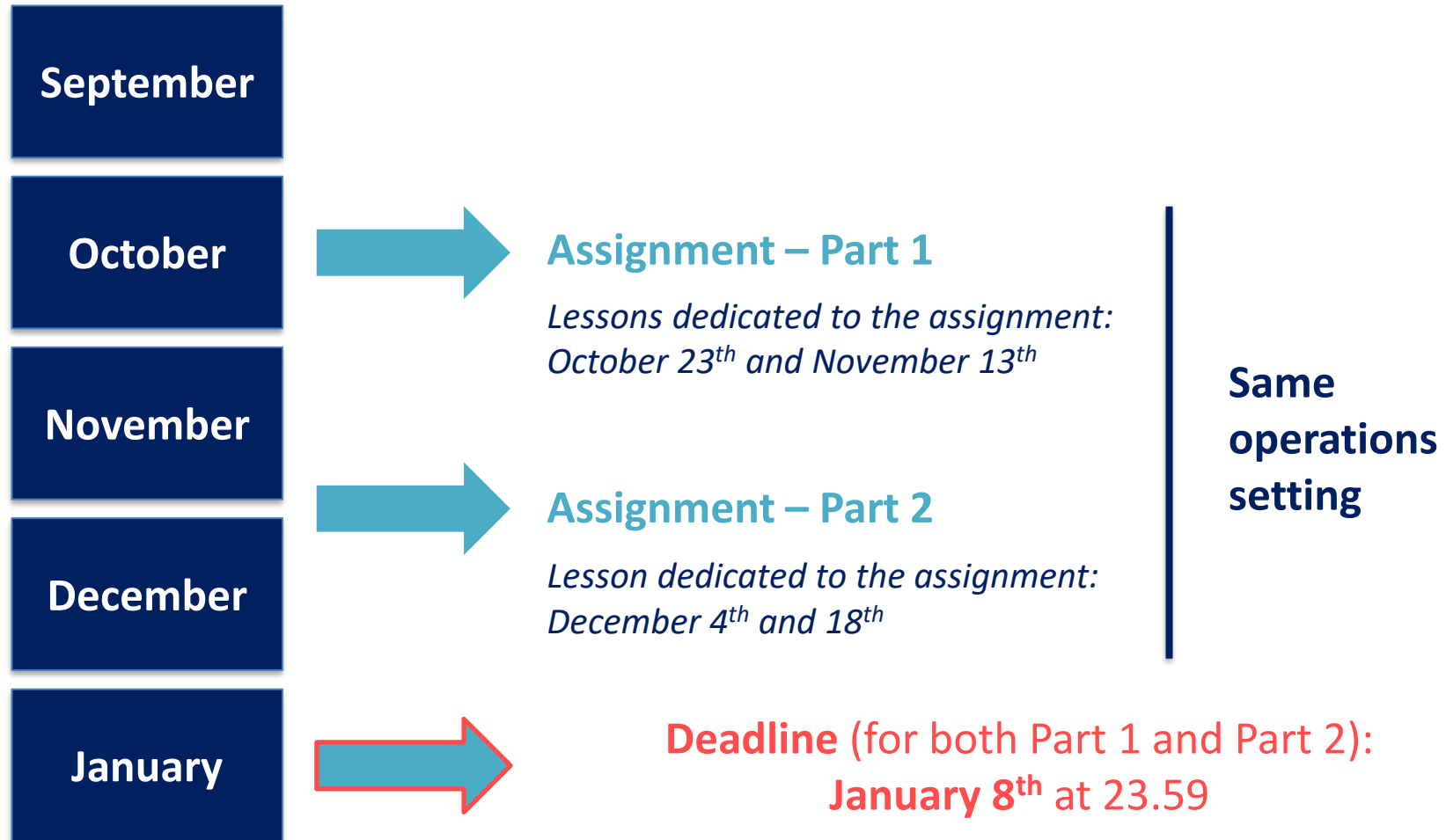
- **Individual written test**



**30%** of the final mark

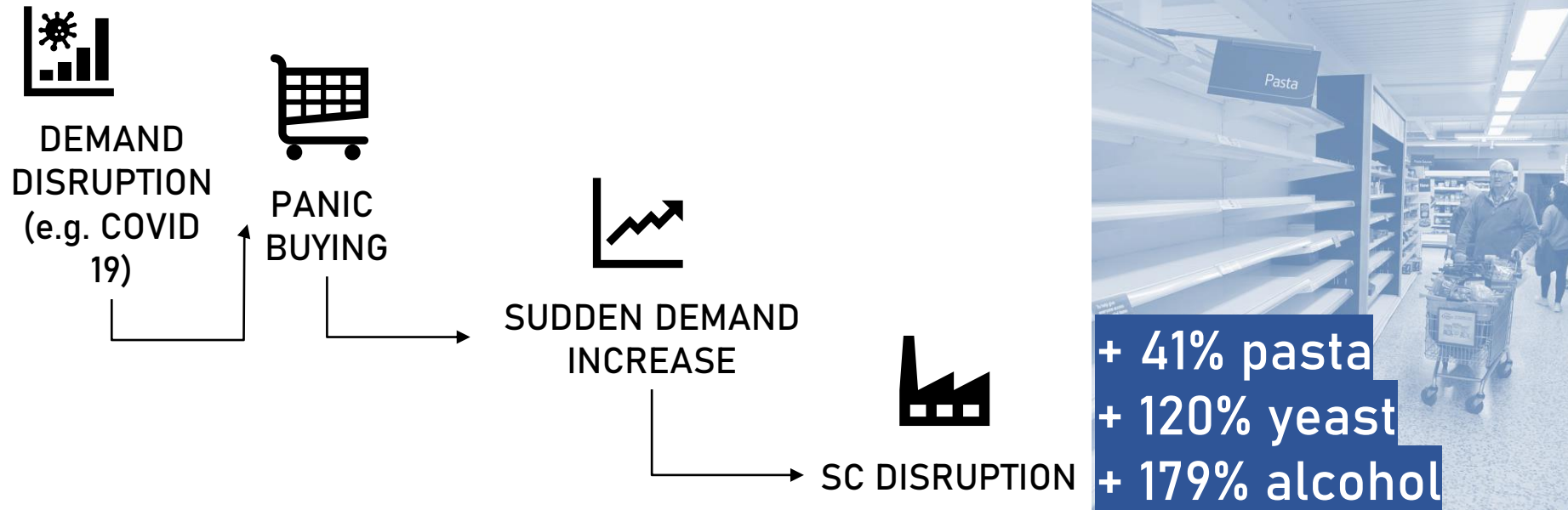
- ***To pass the course, students must pass (grade  $\geq 18$ ) both the group assignment and the individual written test***
- ***The assignment grade will be valid for one academic year (i.e., till September 2024)***
- ***After the delivery of the assignment, each student will be asked to fill in a MS Forms to communicate whether all the group members have actively participated and a penalty can be assigned***

# Assignment Timeline



# Assignment

## Problem description: objective

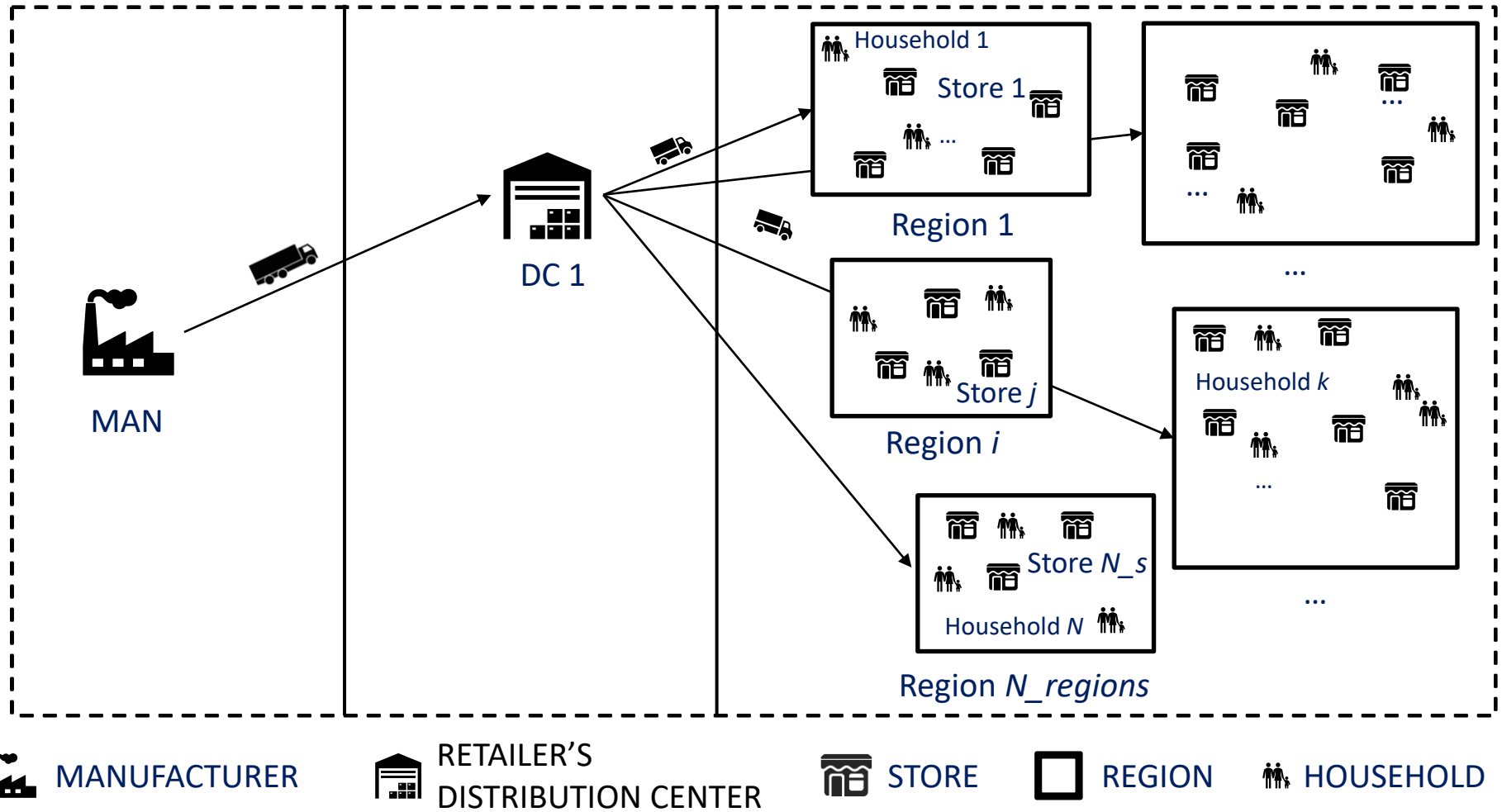


➤ **Objective:** investigate the **response** of **grocery supply chains** to consumer **panic buying** triggered by a large-scale disaster

➤ **Focus on a single product:** pasta 

# Assignment

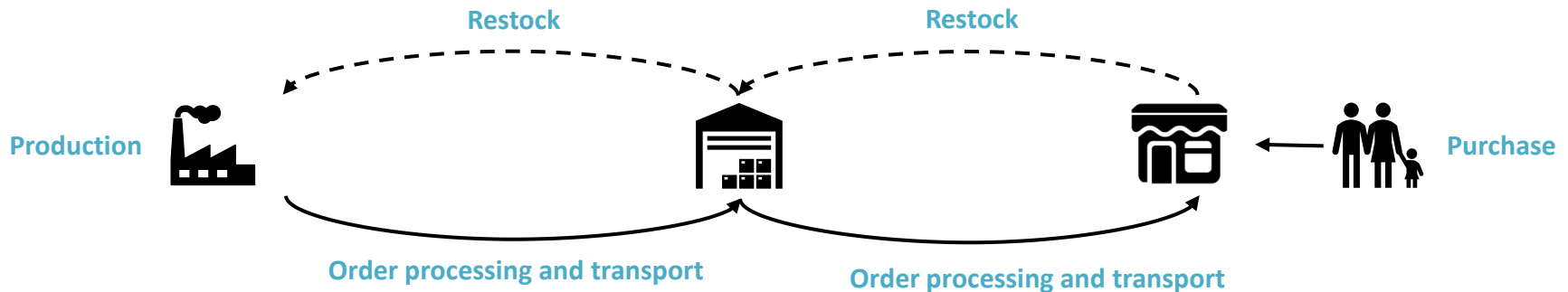
## Problem description: supply chain network



# Assignment

## Problem description: inventory management

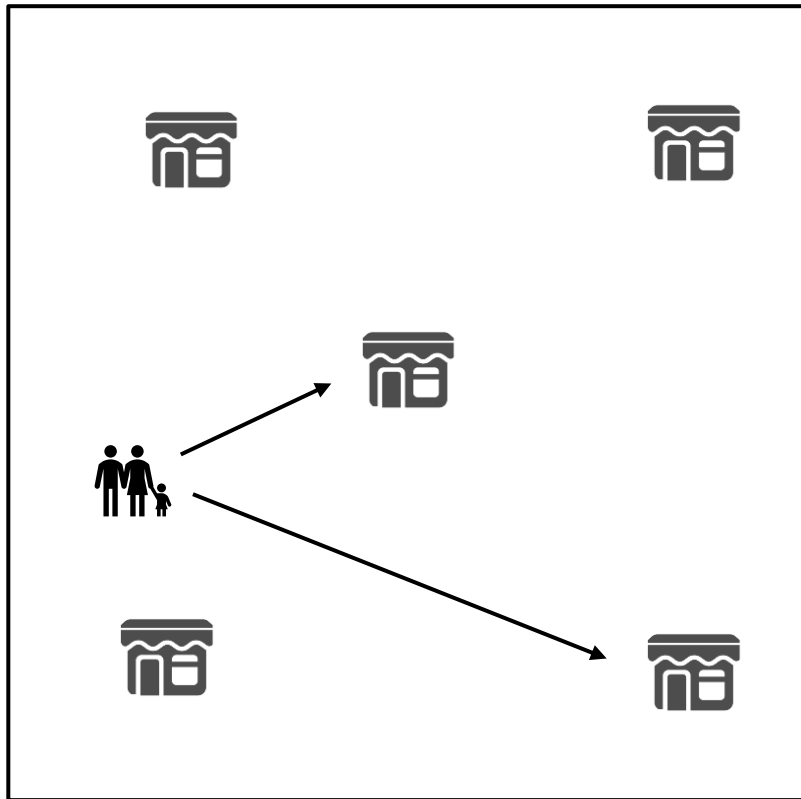
- **MTS production process and PULL LOGIC**
- **Periodic review** inventory control **policy at the distribution center and stores** At the end of every fixed period the store submit a new order request
- **No safety stocks** at the distribution center and stores
- The **plant's production capacity** is **always able to satisfy the distribution center demand**



- **Request for restock every 3 days**  
( $f_{\text{restock}} = 1/3$ )
  - **Manufacturer-to-DC transport time: 2 days**
  - **Order quantity: expected daily demand \* 1/restock frequency**
  - The **daily demand** is **estimated by looking at the restock period** (i.e. 3 days)
- **Request for restock every 3 days**  
( $f_{\text{restock}} = 1/3$ )
  - **DC-to-store transport time: 1 day**
  - **Order quantity: expected daily demand \* 1/restock frequency**
  - The **daily demand** is **estimated by looking at the last 7 days**

# Assignment

## Problem description: purchasing process



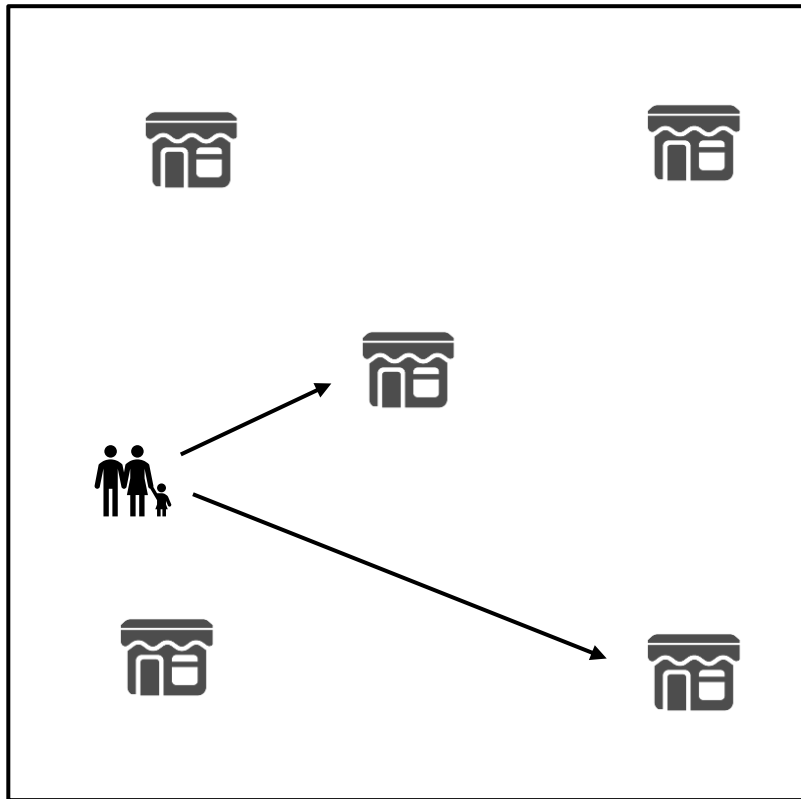
- A **household** (*customer*) purchase a **quantity of pasta  $q$**  with a given **frequency**

PURCHASING FREQUENCY ( $f$ )	PERCENTAGE OF HOUSEHOLDS	$q$ (UNITS of 500 g)
Once every three days, i.e. $f = 0.333$	27%	1
Once per week, i.e. $f = 0.143$	61%	3
Once every 15 days, i.e. $f = 0.067$	10%	6
Once per month, i.e. $f = 0.033$	2%	11

N.B.: the calculation of this distribution was performed starting from the average monthly expense of pasta equal to 11,78€ (Istat) per household, the average price per kg of pasta (2,14€/kg) (Food Report), and the frequency with which an Italian consumer goes to the supermarket (Censis-Coldiretti)

# Assignment

## Problem description: purchasing process

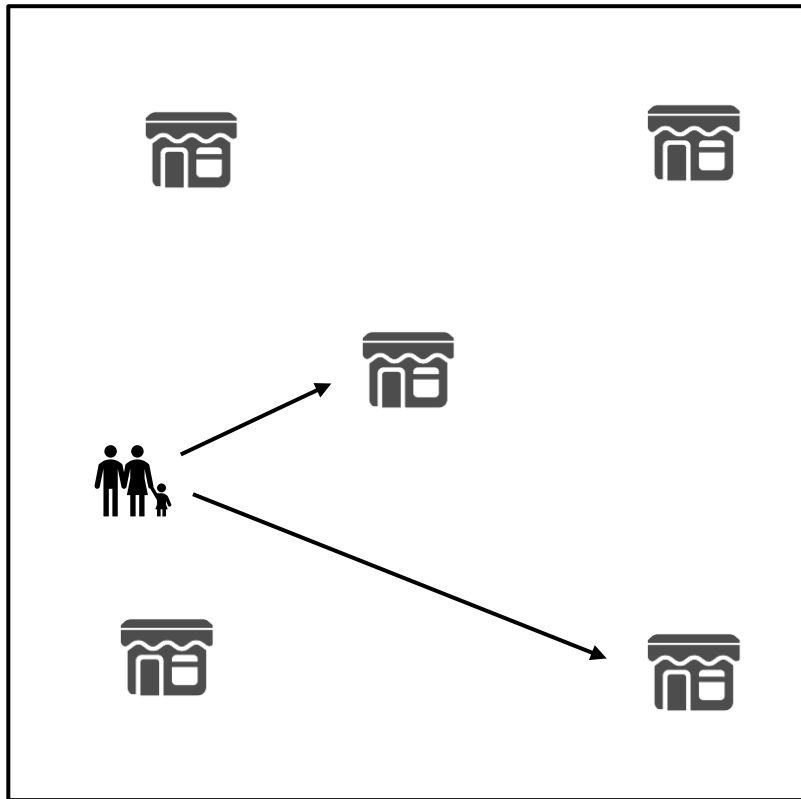


- A **household** (*customer*) purchase a **quantity of pasta  $q$**  with a given **frequency**
- The customer **randomly selects a store** when making a purchase
- **If** the selected **store does not have the entire** customer purchasing **quantity**, the customer purchases an amount equal to the **remaining inventory** at the store
- **In case** the store is in **stock out**, the **customer randomly selects another store** to visit (possibly the customer can visit all the stores)

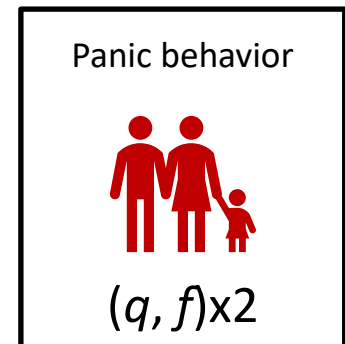
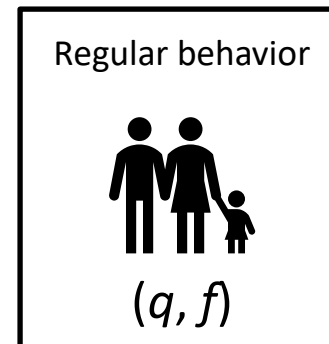


# Assignment

## Problem description: panic buying



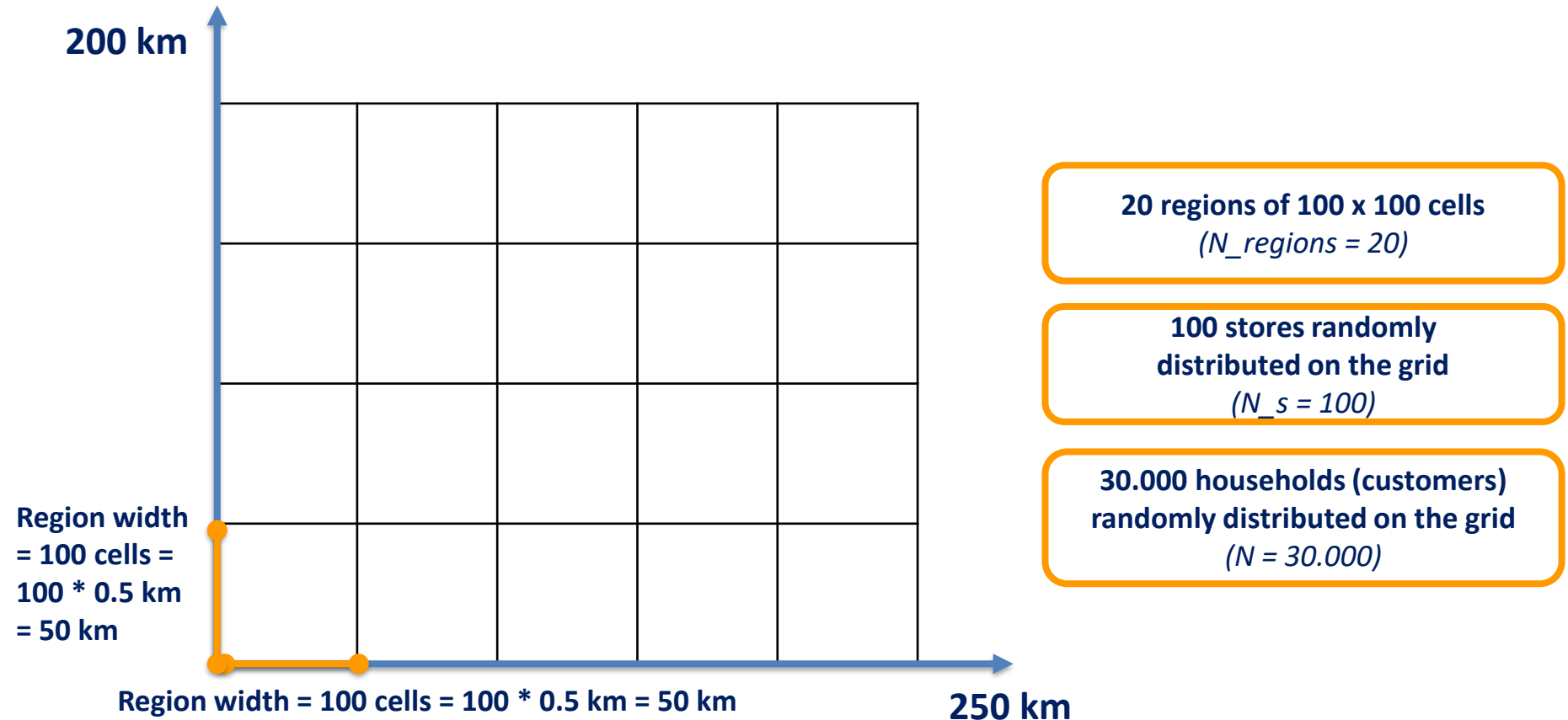
- At **day 15**, the **pandemic starts**
- At each step (day), the **percentage of customers in panic** is **randomly selected** in the range **[0.02; 0.04]**
- The customers with a **panic behavior**, double their **purchasing frequency and quantity** ( $p\_mult = 2$ )



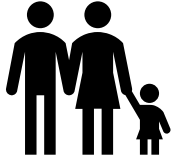
- The **pandemic** has a defined **duration** (i.e. **20 days**)

# Assignment

## Geographical representation: grid



# Assignment Agents



Households → **class Customer**



Stores → **class Store**



Distribution center → **class DistributionCenter**



Manufacturer → **class Manufacturer**

# Assignment

## Agents: attributes and methods



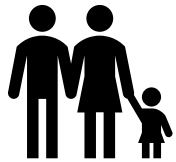
**Class Customer**

### ATTRIBUTES

- Regular purchasing quantity [units] → *q\_base*
- Regular purchasing frequency [/day] → *f\_base*
- Store in which the customer makes a purchase → *purchasing\_store*
- Current purchasing quantity [units] → *q*
- Current purchasing frequency [/day] → *f*
- List of all the stores randomly ordered → *stores*
- Boolean attribute indicating if the customer is in panic → *pbs*

# Assignment

## Agents: attributes and methods



**Class Customer**

### ***METHODS***

At the first step, the **average daily demand for a store is estimated**

→ **store\_visiting\_list\_generation()**

The **current purchasing quantity and frequency** are set according to the customer's status (panic or regular behavior)

→ **initial\_panic()**

The **customer visits the store(s) and makes the purchase** (if one of the visited store has at least one item), **and the store's inventory and demand are updated**

→ **purchase()**

At the first step, the **average daily demand for a store is estimated**; then, at a generic step, the **panic or regular purchasing behavior** is regulated, **and, if the customer makes the purchasing process according to his purchasing frequency**

→ **step()**

# Assignment

## Agents: attributes and methods



**Class Store**

### *ATTRIBUTES*

- Expected demand [units] → *store\_expected\_demand*
- Current inventory [units] → *store\_inv*
- List of the demand at the store in the last 7 days → *d\_s*

# Assignment

## Agents: attributes and methods

### METHODS



Class Store

The store **calculates the amount to be ordered**  
**and sends a restock request** to the DC

→ `store_request_restock()`

In the first step (day), the **starting inventory** of the store  
is determined; then, **at a generic step**, a **restock request**  
to the DC is placed accordingly to the restock period **and**  
**the demand of the past days is updated**

→ `step()`

# Assignment

## Agents: attributes and methods



Class  
DistributionCenter

### ATTRIBUTES

- Expected demand [units] → *dc\_expected\_demand*
- Current inventory [units] → *dc\_inv*
- List of pending orders → *dc\_orders\_waitlist*
- List of orders currently being processed → *dc\_current\_processed\_orders*
- Restock amount for the next order to the manufacturer [units] → *order*
- Amount of requested products that the DC is not able to satisfy in the step [units] → *lost\_restock*



# Assignment

## Agents: attributes and methods



Class  
DistributionCenter

### METHODS

The **orders** are **processed** according to a FIFO policy, **and order waiting list**, the **dc's and stores' inventory**, and **lost demand** are **updated**, as well as the **restock amount to be ordered to the manufacturer**

→ `dc_order_processing()`

The DC **calculates the amount to be ordered and sends a restock request** to the manufacturer

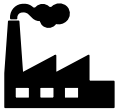
→ `dc_request_restock()`

In the first step (day), the **starting inventory** of the DC is defined; then, **at a generic step, the lists of pending and processed orders are updated**, and a **restock request** to the manufacturer is placed accordingly to the restock period

→ `step()`

# Assignment

## Agents: attributes and methods



### Class Manufacturer

#### ATTRIBUTES

- Manufacturer's production capacity [units] → *m.capacity*
- Restock amount requested by the distribution centers [units] → *restock\_request*
- List of orders currently being processed → *m\_current\_processed\_orders*

# Assignment

## Agents: attributes and methods

### METHODS



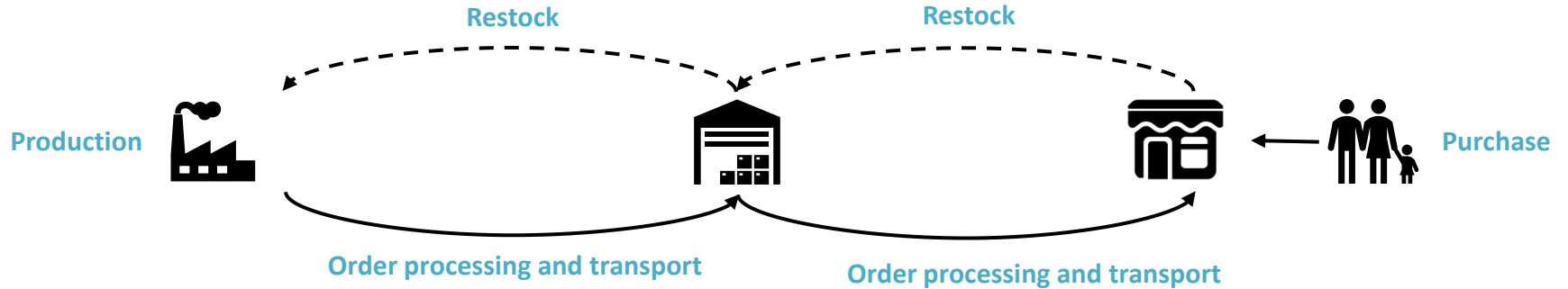
Class  
Manufacturer

The **orders** are **processed** (according to a FIFO policy), and the **dc's inventory, lost demand, and order waiting list** are **updated** → **m\_order\_processing()**

In the first step (day), the **starting capacity** of the manufacturer **is defined**; then, at a generic step, the **lists of pending and processed orders** are **updated** → **step()**

# Assignment

## Performance measure



$$ITEM\ FILL\ RATE_{DC} = \frac{1 - LOST\ DEMAND}{TOTAL\ DEMAND}$$

# Assignment

## Simulation model (“BASE CASE”)

```
Panic Buying Model_base_case.py X
9  """System parameters"""
10 DC_starting_inventory = 10000
11 m_starting_capacity = 10000
12 wh_region = 100          # Width & Height of a region
13 w_grid = wh_region*5     # Full width of the grid
14 h_grid = wh_region*4     # Full height of the grid
15 N_regions = int(w_grid/wh_region)*int(h_grid/wh_region) # Number of regions
16 f_restock = 1/3          # Restock frequency [/day]
17 m_transport_time = 2     # Manufacturer-to-DC transport time [days]
18 dc_transport_time = 1    # DC-to-store transport time [days]
19
20 # Number of agents
21 N_m = 1                  # Number of Manufacturers
22 N_dc = 1                 # Number of distribution centers
23 N_s = 5*N_regions        # Number of stores
24 N = 300*N_s              # Number of customers
25 customer_store_limit = N_s # Limit of stores a customer will visit to satisfy the purchase
26 p_mult = 2               # Multiplying factor for the increase in buying frequency and quantity of a customer
27
28 """Consumption behavior of customers (equal for each region)"""
29 consumption_list_region = np.zeros([int(N/N_regions),2])
30 consumption_list_region[range(int(0.27*N/N_regions))] = [0.333, int(1)]
31 consumption_list_region[range(int(0.27*N/N_regions),int(0.88*N/N_regions))] = [0.143, 3]
32 consumption_list_region[range(int(0.88*N/N_regions),int(0.98*N/N_regions))] = [0.067, 6]
33 consumption_list_region[range(int(0.98*N/N_regions),int(N/N_regions))] = [0.033, 11]
34 consumption_list_region = consumption_list_region.tolist() #convert a given array to an ordinary list with the same items, e
35
36 """Agent classes definition"""
37 class Customer(Agent):
38     def __init__(self, unique_id, model):
39         super().__init__(unique_id, model)
40         self.q_base = 0 # Customer's regular purchasing quantity
41         self.f_base = 0 # Customer's regular purchasing frequency
42         self.purchasing_store = 0 # Store in which the customer makes a purchase
43         self.q = self.q_base # Customer's current purchasing quantity
44         self.f = self.f_base # Customer's current purchasing frequency
45         self.stores = [] # List of all stores. The list determines the sequence according to which the Customer v
46         self.pbs = False # Customer's panic buying sensitivity
47
48     def store_visiting_list_generation(self):
49         """The sequence of stores the Customer can visit is retrieved"""
50         s_list = np.array(self.model.schedule.agents[N:N+N_s]) # the Store agents are retrieved
51         self.stores = s_list
52         self.purchasing_store = random.choice(self.stores) # the Customer chooses
53         self.purchasing_store.store_expected_demand += self.q_base*self.f_base
54
55     def initial_panic(self):
56         """Initial panic"""
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minimal dc ifr = 0.12839113074068842
```

# Assignment

## Part 1 – Tasks

1. Identify the **“weaknesses” of the given model (“BASE CASE”)**, **describing them and commenting on their impact on the model quality** (i.e., accuracy in representing the real-life problem and decision-making)

Examples of “weaknesses”:

- Performance measures used to study the problem
- Modeling of the agents’ behavior
- ...

2. Create an **updated version of the model that allows achieving:**
  - an **average item fill rate** at the **distribution center** **higher than 95% before and after the pandemic;**
  - a **minimum item fill rate** at the **distribution center** **higher than 60% during the pandemic.**

*N.B.: the updated version is obtained by “solving” one or more of the previously identified weaknesses (you will choose which and how many weaknesses to “solve”)*

# Assignment

## Part 1 – Output

- **Power point** presentation of **15-20 slides**
- **Python script**
- **Excel file (if needed)**
- The files should be **uploaded on WeBeep (*Assignments* Section)** in a zip folder named **“Group\_XX”**, where XX is the group number

# Assignment

## Evaluation criteria

- **Fulfilment of the requirements (tasks and deadline)**
- **Quality of:**
  - list of weaknesses and related motivations
  - obtained SC performance
  - updated version of the BASE CASE model
- **Originality**
- **Quality of the .ppt document** (i.e., sequence of the contents, clear description of the work, document readability)



# Questions?

