



# Potential Access Hub Network Design Optimization in Hyperconnected Urban Logistics

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## Introduction

### ☐ Impact of Lockdown Effect During COVID-19 Pandemic

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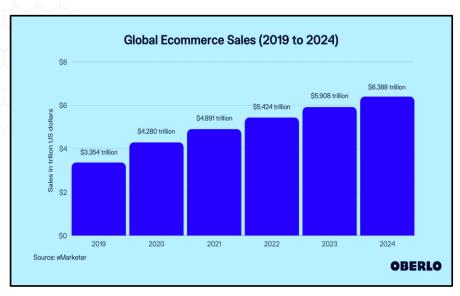
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Retail store closures from 2017 to 2020 in US



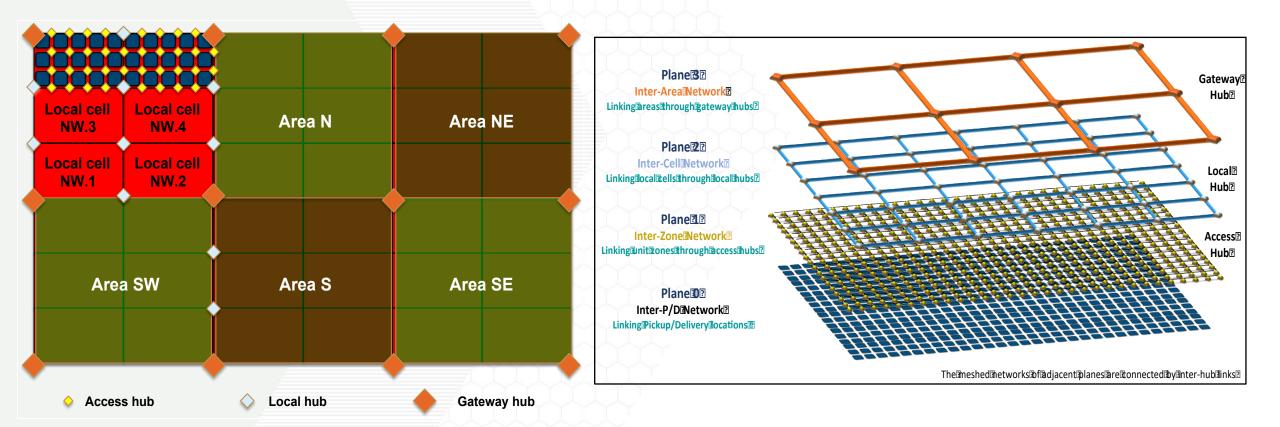
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# Hyperconnected Logistic web: The Next-Gen

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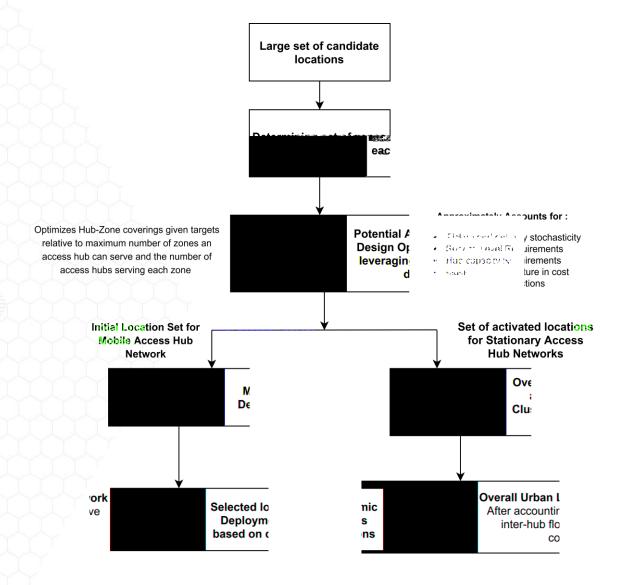
"Future of retail might be transformation of stores into mini- or micro-Distribution Centers located near customer locations to meet increased e-commerce demands and fulfillment timelines"





## **Problem Definition**

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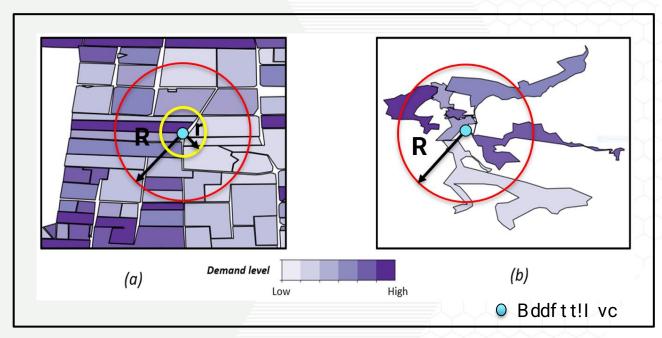
## Assumptions used in the Proposed Optimization Model

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## Allocation of locations to unit zones

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Accounting for distribution of unit zones across the megacity

- (a) Dense collection of unit zones smaller in area
- (b) Sparse collection of unit zones larger in area

## **Optimization Model - Decision Variables and Parameters**

#### **Mathematical Sets:**

U set of unit zones

A set of candidate locations

P set of {zone, location} pairs where  $(u, h) \in P$  implies o pof  $u \in U$  can be served from location  $h \in A$ .

#### Parameters:

 $s_u$  total pickup and delivery demand of unit zone  $u \in U$ 

 $m_u$  minimum number of activated locations required near unit zone  $u \in U$ 

 $t_h$  maximum number of unit zones that can be served from location  $h \in A$ 

 $C_m$  fixed cost of adding a module

 $C_u(s_u, h)$  operation cost estimates of courier (s) serving  $u \in U$  from hub at location  $h \in A$ 

 $C_d(h)$  fixed cost of deploying a hub at location  $h \in A$  - can be interpreted as land-reservation cost

 $Q_u$  maximum of inbound or outbound parcels at unit zone  $u \in U$  during rider replenishment cycle

 $\alpha$  capacity of a module

 $g_u$  known % imbalance in demand assigned to hubs capable of serving unit zone  $u \in U$  and  $g_u = 0$  if  $m_u = 1$ 

#### **Decision Variables:**

 $X_h$  0-1 variable indicating if hub is deployed at location  $h \in A$ 

 $Y_{uh}$  0-1 variable indicating if hub at location  $h \in A$  is chosen to serve  $u \in U, \forall (u, h) \in P$ 

 $Z_h$  number of modules added at location  $h \in A$ 

## **Integer Programming Formulation**

min 
$$\left(\sum_{(u,h)\in P} C_u(s_u,h) * Y_{uh} + \sum_{h\in A} C_d(h) * X_h + \sum_{h\in A} C_m * Z_h\right)$$

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Subjected to:

$$\sum_{u \in U} Y_{uh} \leq t_h * X_h \quad \forall h \in A$$

$$\sum_{h \in A} Y_{uh} \ge m_u \quad \forall u \in U$$

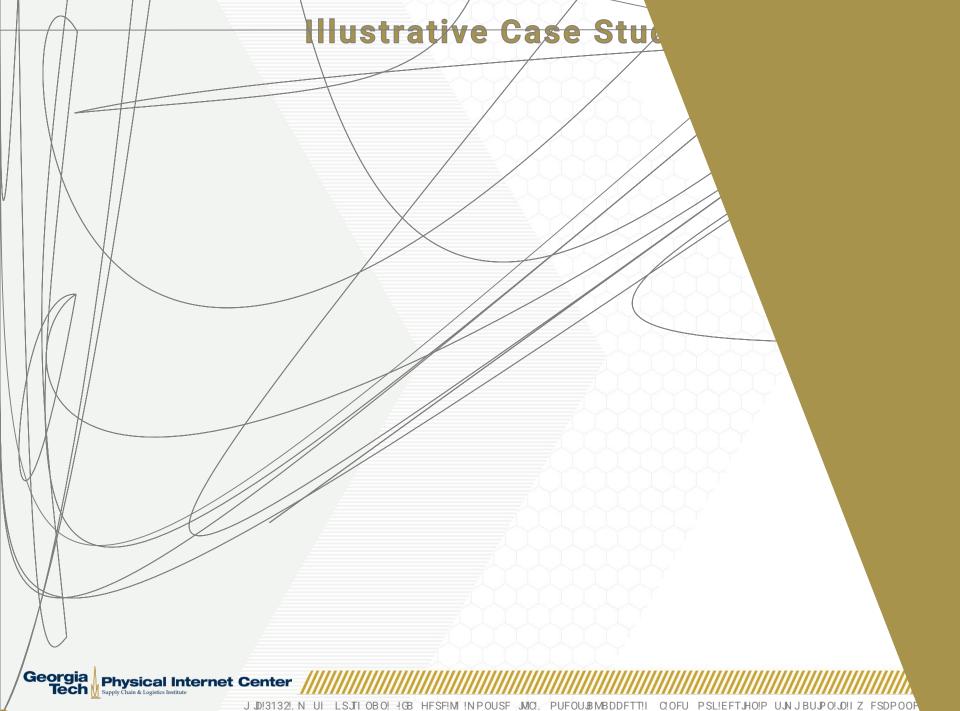
$$\sum_{u:(u,h)\in P} \left(\frac{1}{m_u} + g_u\right) Q_u * Y_{uh} \le \alpha * Z_h \quad \forall h \in A$$

$$Z_h \leq M * X_h \quad \forall h \in A$$

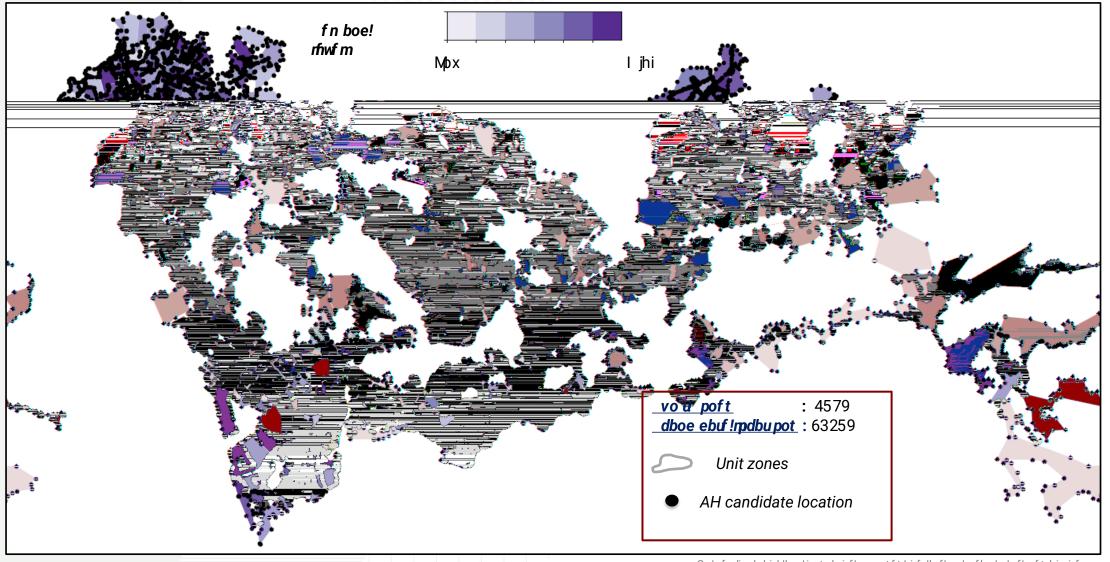
$$0 \le X_h, Y_{uh} \le 1, Z_h \ge 0 \quad \forall h \in A, (u, h) \in P$$

$$X_h, Y_{u,h}, Z_h$$
 Integers, M is a sufficiently large positive number (7)

(6)

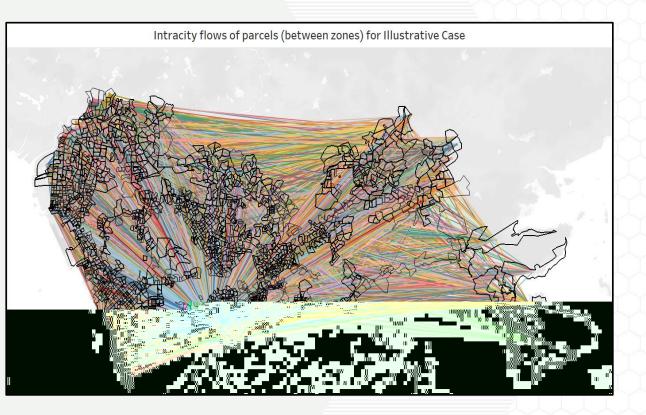


## Illustrative Case Study - Map Containing all Unit Zones & Candidate Locations

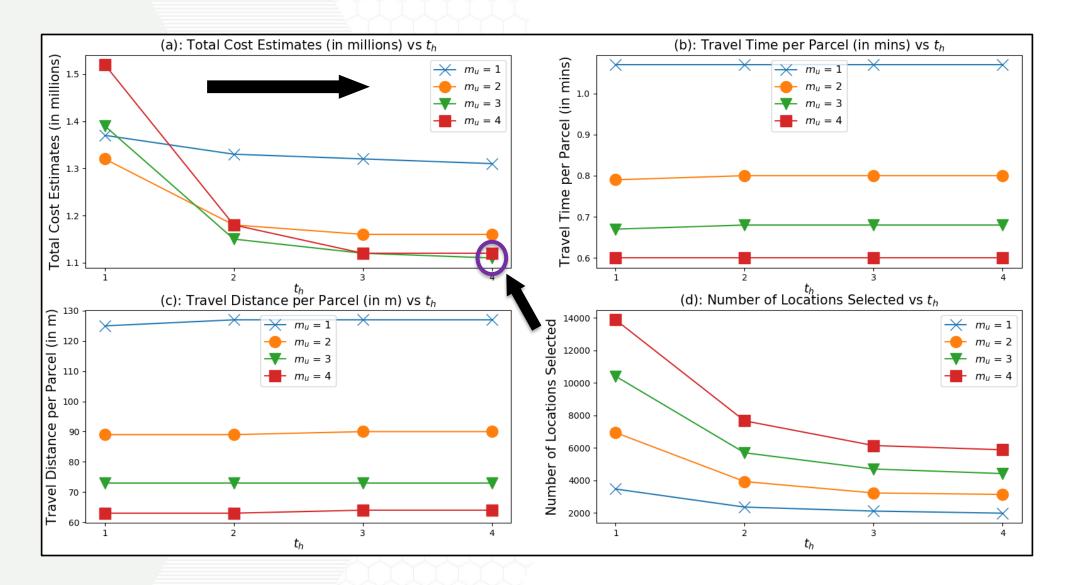


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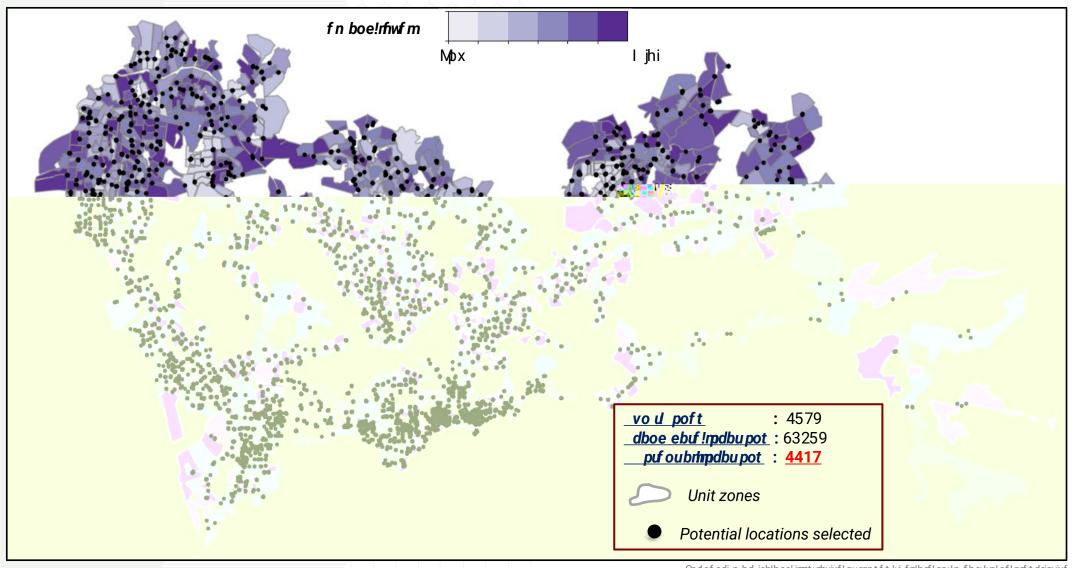




# Key Performance Indicators vs $t_h$



# Activated Locations chosen in the case: $m_u=3$ and $t_h=4$



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## **Future Avenues for Research & Innovation**

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# Questions, comments and ideas are most welcome!

