

# Last-mile Delivery with Crowd-shipping and Mobile Depots

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# Trends in E-commerce

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- E-commerce revenue is expected to **increase 48% from 2018 to 2023**.
- A research survey for logistics providers and retailer, showed that **87% of respondents would make use of crowd-sourced delivery by 2028** compared to 30% in 2019!
- A new data from IBM's retail index shows that **the covid-19 pandemic has accelerated retail and e-commerce trends by around 5 years!**



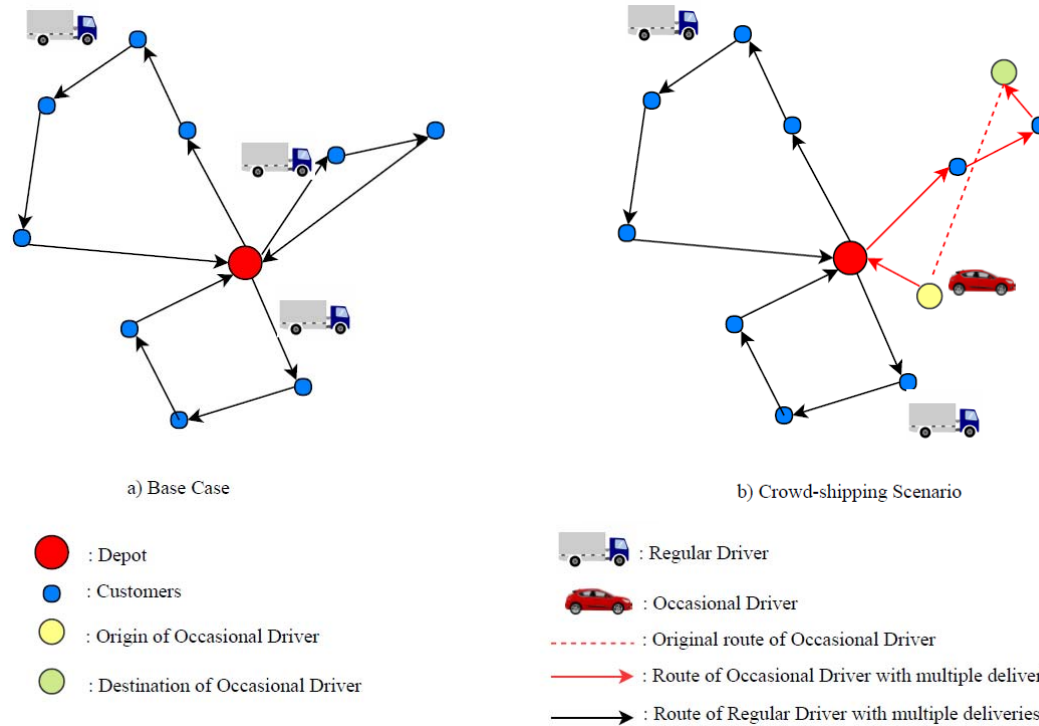
# Crowd-shipping

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Sharing and using existing individuals' spare time and/or vehicle capacity for delivering goods.



# Example of operation in crowd-shipping



# Motivation

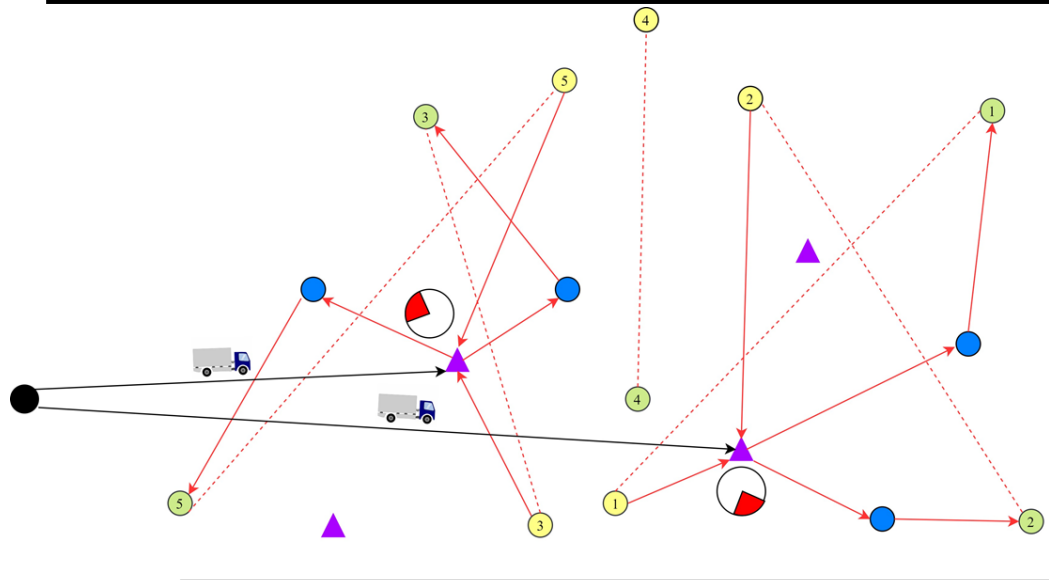
- Most warehouses are outside urban areas:  
**No access to majority potential crowd-shippers**
- More crowd-shippers :  
**More cost-efficient operation**
- Establishing fixed facilities usually requires large investment:
  - **Not desirable for many startups**



Decentralization and mobile facilities can be an option!



# Crowd-shipping operation with mobile depots



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|--|---|
| ● : Main depot (outside of the region) | 🚚 : Mobile depot                        |
| ● : Customer                           | 🕒 : Mobile depot operational time frame |
| ● : Origin of crowd-shipper            | --- : Original route of crowd-shipper   |
| ● : Destination of crowd-shipper       | → : Route of Crowd-shipper              |
| ▲ : Mobile depot stopping location     | → : Route of mobile depot               |

## Problem description:

- Selecting mobile depot stopping locations.
- Assigning customers to mobile depot.
- Assigning customers to crowd-shippers.
- Decision on serving or rejecting customers
- Minimizing total operational cost.

The Problem is formulated as an integer program



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# Study area (Toronto, Canada)



-  Customer
-  Parking (mobile depot locations)
-  Main Depot



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# Data

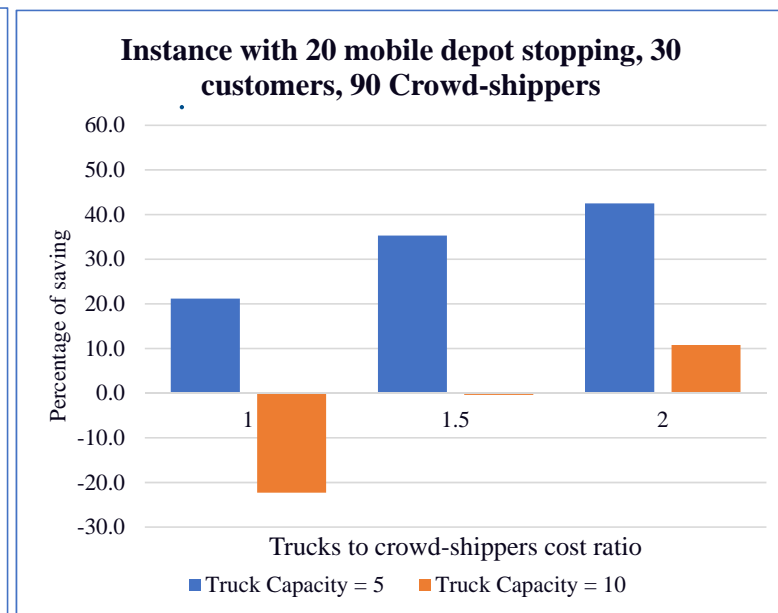
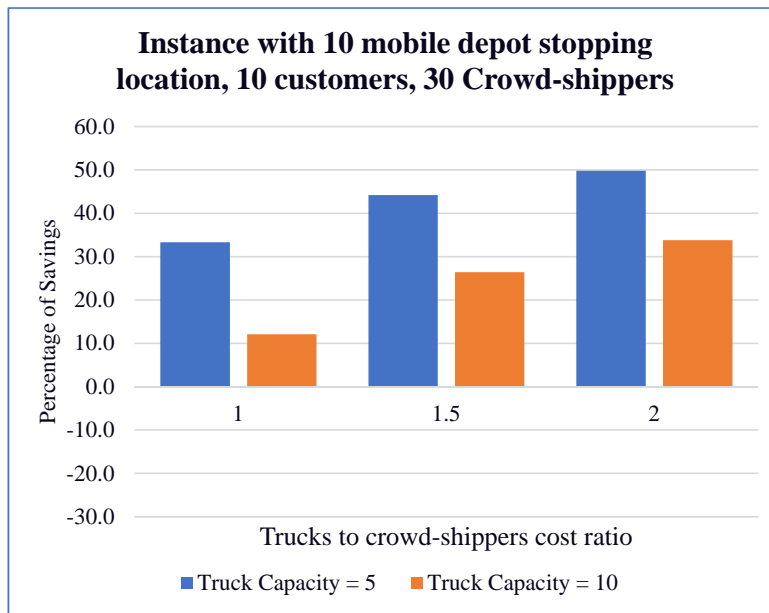
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- **Based on TTS** (Transportation Tomorrow Survey) 2016
- **Customers locations** are randomly generated in proportion to the population of each traffic zone
- **Crowd-shippers** are randomly generated based on TTS demand for origin-destination pairs
- **Mobile depot stopping locations** (parkings) are selected by considering proximity into neighborhood centers and availability of large outdoor parking lots





# Cost Saving: **Deterministic model** vs CVRP



Mobile Depot Capacity is fixed to 10



# Stochasticity matters

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- Uncertainty in input data.
  - Availability of crowd-shippers are highly uncertain.
- Exact data is unavailable or expensive – data is uncertain, specified by a probability distribution.
  - Availability of crowd-shippers follow a probability distribution
- Want to make the best decisions given this uncertainty in the data.
  - Where and when to send mobile depots



# Incorporating stochasticity

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Two-Stage Stochastic Integer programming model:

- First-stage decisions:
  - Where and when set up mobile depots
    - Assignment of customer packages to mobile depots
    - Decision on serving customers

After revealing the crowd-shippers availability



- Second-stage decisions:
  - Assigning crowd-shippers to customers

Choose first-stage decisions to minimize:

(First-stage cost) + (Expected second-stage operational cost).



# Solution Method and Value of Stochasticity

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- Solving the stochastic model with the methods in optimizers such as CPLEX is computationally prohibitive for medium and large instances!
- Benders decomposition algorithm is introduced for solving the stochastic model enabling us to solve the stochastic model for medium and large instances.
- The stochastic model results in an average 6% percent cost saving compared to deterministic model for the largest instance.



# Conclusion

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- The **new Crowd-shipping** operation has more **cost efficiency** than CVRP!
- The model favors **urban areas** that has access to potential crowd-shippers!
- **Stochasticity in availability of crowd-shippers** is incorporated in our model.
- **Benders decomposition algorithm** is introduced for solving the model.
- **Value of Stochastic Solution** is shown.



# Thanks you!

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**More details about this work can be found below:**

Mousavi, K., Bodur, M., & Roorda, M. Stochastic last-mile delivery with crowdshipping and mobile depots (2020). *Available at optimization-online.org, 276.*



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