



OPTIMIZING E-COMMERCE LAST-MILE DELIVERY THROUGH DYNAMIC
ROUTING: ENHANCING OPERATIONAL EFFICIENCY AND CUSTOMER
SATISFACTION

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Abstract

The e-commerce industry is under pressure to improve operational efficiency to grow in a competitive market. This paper examines the transformative potential of dynamic routing, an adaptive method designed to optimize last-mile delivery routes in real time. Dynamic routing, in contrast to traditional static routing, utilizes data including traffic conditions, driver locations, and weather patterns to continuously optimize routes, resulting in significant enhancements in efficiency and customer satisfaction. This study examines the challenges associated with traditional e-commerce logistics, specifically last-mile delivery, and demonstrates how dynamic routing presents a feasible alternative solution. This study investigates the internal mechanisms of dynamic routing, its diverse applications in e-commerce, and its broader implications for businesses, consumers, and the environment. The paper concludes that dynamic routing represents a significant technological advancement essential for the success of e-commerce companies in a competitive market.

Keywords: Dynamic Routing, E-commerce, Fulfillment Optimization, Logistics, Last-Mile Delivery, Real-time Optimization, Customer Satisfaction, Operational Efficiency, Supply Chain Management, Delivery Route Optimization, Machine Learning, Artificial Intelligence, Algorithm, Predictive Analytics, Delivery management, Warehouse management.

I. INTRODUCTION

The swift expansion of e-commerce has transformed retail, providing unmatched convenience and options for consumers. This growth has resulted in considerable logistical challenges, especially regarding order fulfillment. The final segment of delivery, transitioning from the warehouse to the consumer's residence, frequently represents the most intricate and costly component of the e-commerce supply chain.

Conventional fulfillment methods typically depend on fixed routing, with delivery routes being predetermined and infrequently modified. This method faces challenges in addressing the dynamic characteristics of real-world logistics. Unforeseen occurrences such as traffic congestion, alterations in weather conditions, and the introduction of new orders can undermine even the most carefully devised static routes, resulting in delays, heightened expenses, and diminished customer satisfaction. The increasing customer expectations for rapid and dependable delivery highlight the necessity for a more flexible approach.



Dynamic routing serves as a viable solution. Envision an advanced navigation system for delivery fleets, characterized by enhanced intelligence. It considers real-time traffic, weather, driver locations, new orders, and additional factors to calculate optimal routes, continuously adjusting to evolving conditions. This study examines dynamic routing as a significant factor in e-commerce fulfillment. This study will analyze its capacity to overcome the limitations of conventional approaches and its potential to transform the future of online retail.

II. PROBLEM STATEMENT

The primary issue resides in the inefficiencies associated with conventional e-commerce fulfillment, especially within the last-mile delivery sector. This stage frequently represents the highest cost and greatest time investment in the process, and it is also where errors are likely to occur. Static routing, as a conventional method, frequently results in various interrelated challenges:

1. **Increased Delivery Times:** Static routes can be viewed as a uniform solution. They do not consider the unforeseen factors. Traffic congestion, road obstructions, or unexpected precipitation can result in considerable delays. Fixed delivery routes frequently result in vehicles encountering unexpected delays, which can lead to missed delivery windows and dissatisfied customers.
2. **Increased Operational Costs:** Inefficient routing results in prolonged driving times, leading to higher fuel consumption and elevated labor expenses. Extended routes, increased idling time in traffic, and the necessity for additional drivers contribute significantly to overall costs.
3. **Decreased Customer Satisfaction:** In the current era of immediate gratification, customers anticipate prompt and dependable deliveries. The experience of waiting all day for a package that does not arrive can be quite frustrating. Delays and unpredictable delivery times adversely affect customer satisfaction and brand loyalty.
4. **Inflexibility and Lack of Responsiveness:** Static routes exhibit rigidity. They are unable to adjust to abrupt changes, such as a new order requiring pickup or a customer requesting a modification in delivery time. Static routing is unable to adapt to real-time variations in demand, delivery locations, or traffic conditions, which limits the capacity to optimize routes dynamically.
5. **Environmental Impact:** Extended, inefficient routes result in heightened fuel consumption and carbon emissions, exacerbating environmental issues. The increase in gas prices, coupled with environmental concerns, presents a significant challenge for both corporations and consumers.
6. **Ineffective resource utilization:** It occurs when inefficient routing results in underutilized delivery vehicles and drivers. Consider the scenario where delivery trucks return to the warehouse without cargo after completing deliveries in a unidirectional manner.
7. **Difficulty in Scaling:** As e-commerce businesses expand, the complexities associated with managing deliveries using static routes increase significantly. Consider a company that processes hundreds or even thousands of new orders daily. Managing deliveries with pre-planned routes proves to be exceedingly challenging.



III. SOLUTION: DYNAMIC ROUTING FOR E-COMMERCE LAST-MILE DELIVERY

Dynamic routing presents an effective approach to addressing the challenges encountered by conventional e-commerce fulfillment models. It resembles the transition from a static road map to an advanced GPS system that continuously adjusts routes according to real-time conditions. Dynamic routing fundamentally entails the ongoing optimization of delivery routes utilizing various real-time data inputs and advanced algorithms. This approach signifies a notable shift from the inflexibility of static routing, adopting a more adaptable, responsive, and efficient method for managing logistics.

Key Components of a Dynamic Routing System:

1. **Real-time Data Integration:** It serves as the foundational element for dynamic routing. The system functions as a central hub, aggregating data from multiple sources. The sources include:
 - i. **GPS Tracking of Vehicles:** It provides real-time location data for each vehicle within the fleet. This enables the system to accurately determine the location of each driver at any specific time [1].
 - ii. **Real-time Traffic Updates:** Integration with traffic data providers such as Google Maps, TomTom, or Inrix to obtain a live feed of traffic conditions, encompassing accidents, congestion, and road closures.
 - iii. **Weather Forecasts:** Utilizing meteorological data to predict possible delays resulting from precipitation, snowfall, or other unfavorable conditions.
 - iv. **Order Management Systems:** They provide real-time updates regarding new orders, modifications to existing orders, and cancellations. This is essential for real-time route adaptation [2].
 - v. **Customer Preferences:** Data regarding preferred delivery times, specific instructions, and customer feedback to customize deliveries according to individual requirements.
 - vi. **Delivery Driver App:** It offers drivers real-time updates on routes, customer information, and delivery confirmations. Enables dispatchers to monitor delivery statuses in real-time.

Example: When a delivery driver approaches an intersection. The dynamic routing system integrates real-time traffic data to identify sudden traffic congestion resulting from an accident. This information is then promptly transmitted to the system's core for processing.

2. **Advanced Algorithms:** These algorithms serve as the core components of the operation. These are advanced mathematical models that analyze extensive data sets, continuously recalculating to identify the most efficient routes. These algorithms consider:
 - i. **Distance:** Determining the minimal physical separation between points.
 - ii. **Delivery Time Windows:** Guaranteeing that deliveries occur within the customer's specified time frame [3].
 - iii. **Vehicle Capacity:** Assessing the dimensions and load capacity of each vehicle to prevent overloading.
 - iv. **Driver Availability:** It must consider schedules, breaks, and working hours.
 - v. **Fuel Efficiency:** Route optimization to reduce fuel consumption.



vi. **Road Restrictions:** Consideration of road closures, weight limits, and additional restrictions.

Example: Building on the prior example, the algorithm acquires data regarding the traffic congestion. It efficiently evaluates alternative routes by taking into account variables such as distance, projected travel time, and delivery deadlines associated with other orders assigned to the same driver.

3. **Predictive Analytics:** Through the analysis of historical data, including past delivery times, traffic patterns, and order volumes, alongside real-time trends, the system can generate accurate predictions regarding potential delays or disruptions. This facilitates proactive modifications to routes, effectively anticipating issues prior to their emergence.

i. **Historical Data Analysis:** The system acquires knowledge from previous deliveries. For example, it may recognize that a specific route experiences persistent congestion during peak hours [4].

ii. **Trend Identification:** The system is capable of identifying emerging patterns in real time. For example, the placement of multiple new orders in a specific area may indicate a rise in demand, prompting adjustments to delivery routes.

Example: Historical data may indicate that the vicinity of a stadium will likely encounter significant traffic following a major sporting event. It actively redirects drivers assigned to deliver in that area during that period, thereby avoiding congestion caused by post-game traffic.

4. **Machine Learning:** This is the point at which the system attains true intelligence. Machine learning enables the dynamic routing system to perpetually enhance its routing capabilities through ongoing learning. It involves not merely adhering to established protocols, but also adapting and evolving in response to experiential learning [5].

i. **Continuous Improvement:** The system evaluates the results of previous routing decisions. If a specific route consistently exceeds the predicted duration, the algorithm modifies its parameters to enhance future accuracy.

ii. **Adaptive Learning:** The system adjusts to evolving conditions. For example, when a new road is constructed or a construction project commences, the system adapts by integrating these modifications into its route calculations [6].

Example: The system initially miscalculates the duration required to traverse a specific hilly area. Following multiple deliveries, the system analyzes actual delivery times and modifies its algorithm to accommodate the reduced speeds necessary for hilly terrain. In the future, it will yield more precise time estimates and optimize route guidance for drivers in that region.

5. **User Interface:** User Interface (UI) allows humans to interact with the system. A well-designed user interface is essential for dispatchers and drivers alike.

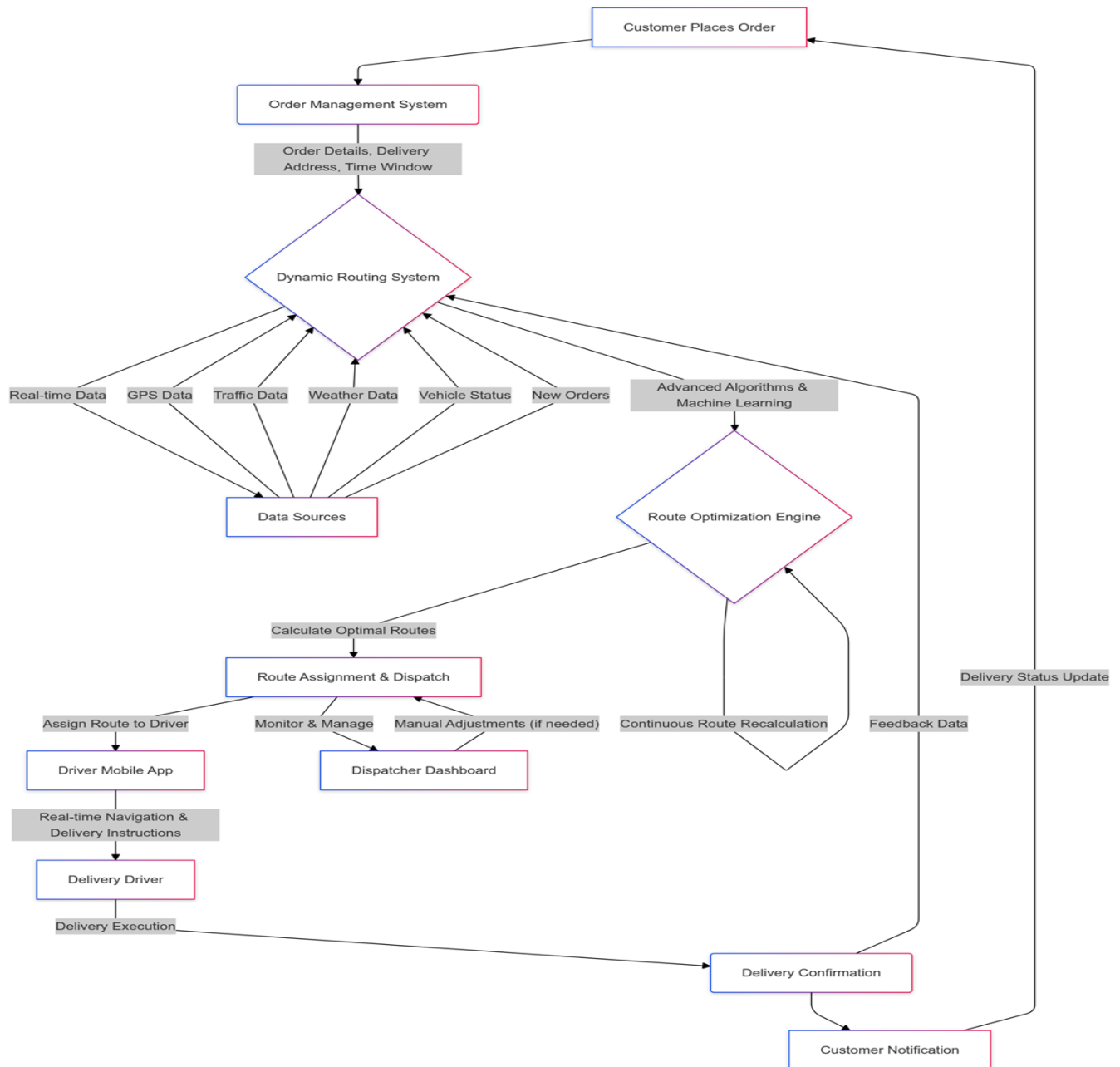
i. **Dispatcher Dashboard:** The Dispatcher Dashboard enables real-time monitoring of all vehicles, provides access to route details, tracks delivery progress, facilitates communication with drivers, and allows for manual route adjustments as necessary.

ii. **Driver Mobile App:** The Driver Mobile App offers turn-by-turn navigation, optimized route updates, delivery instructions, customer information, and a communication



channel with dispatchers. This system will enable drivers to gather electronic signatures and various types of delivery confirmations.

Example: A dispatcher observes an atypical delay in a driver's route. The dashboard enables monitoring of the driver's location, facilitates communication to ascertain the issue, and allows for manual rerouting to prevent additional delays if required. The driver obtains the revised route via their mobile application, facilitating a seamless adjustment to the new plan.





IV. HOW DYNAMIC ROUTING WORKS IN PRACTICE:

The below will illustrate the concept of dynamic routing in practice.

1. **Order Placement:** A customer residing in a suburban area submits an order for a new coffee maker through an e-commerce platform. The selected delivery window is from 2 PM to 4 PM the following day. The order information, comprising the delivery address, preferred time window, and product details, is promptly integrated into the dynamic routing system.
2. **Initial Route Calculation:** The system activates promptly. The analysis encompasses the present positions of all accessible delivery vehicles within the region, real-time traffic conditions on primary roads and highways, weather data indicating a forecast of light rain in the afternoon, and additional pertinent factors such as road closures resulting from a local festival. The algorithm of the system computes the optimal route for the new order based on the provided data. It takes into account scheduled deliveries for the following day, vehicle capacities, and driver availability [7]. A driver engaged in deliveries in a nearby town has been identified as the most suitable candidate. A preliminary route has been established, with an estimated delivery time of 2:30 PM, which falls within the customer's selected time frame.
3. **Route Assignment and Driver Notification:** The determined route, in conjunction with the new order information, is transmitted to the designated driver's mobile application. The driver is notified of a new delivery that has been incorporated into their optimized route for the following day. The application offers sequential navigation, customer contact details, and specific delivery instructions.
4. **Real-time Monitoring and Adjustments (Dynamic):** On the following day, as the driver commences their route, the dynamic routing system persistently observes the conditions.
 - **Scenario 1: Unexpected Traffic:** During mid-morning, a significant highway faces an unforeseen closure resulting from an overturned truck. The system promptly identifies this via its integration with real-time traffic data. The algorithm recalculates routes for all impacted drivers, including the driver assigned to the coffee maker delivery. The driver is notified via the app, which provides a revised route that circumvents the highway closure. The revised estimated delivery time is 2:45 PM, remaining within the designated delivery window.
 - **Scenario 2: New High-Priority Order:** An urgent same-day delivery request for a laptop has been received for a business situated near the coffee maker's delivery location. The dynamic routing system designates the driver allocated to the coffee maker as the nearest available driver. The algorithm evaluates the effect of incorporating this new high-priority delivery into the driver's current route. The assessment indicates that the driver can fulfill the new order without substantially affecting the delivery timeline of the coffee maker. The driver obtains the updated order information via their application, prompting an adjustment to the route.
 - **Scenario 3: Customer Request:** The customer who ordered the coffee maker acknowledges that they will not be home until later in the afternoon. Customers contact service representatives to request a modification of the delivery schedule. This request has been submitted to the system. The algorithm recalculates, assesses feasibility, and



modifies the driver's route, rescheduling the coffee maker delivery to the conclusion of the driver's shift.

5. **Delivery Confirmation:** The driver completes the delivery of the laptop to the business before moving on to deliver the coffee maker. Upon arrival, a signature is obtained from the customer via the mobile application. This information is promptly communicated back to the system, verifying the delivery. An automated notification is sent to the customer to confirm the delivery of their order.
6. **System Learning:** The dynamic routing system has accumulated extensive data throughout the day, including actual travel times, encountered traffic conditions, the effects of the new high-priority order, and changes in the customer's delivery time. The data informs machine learning algorithms, enhancing the accuracy and efficiency of future route calculations over time [8].

V. ADVANTAGES OF DYNAMIC ROUTING:

1. **Reduced Delivery Times:** Dynamic routing optimizes routes in real-time, thereby ensuring expedited delivery of goods. More efficient routes result in expedited deliveries [9].
2. **Lower Operational Costs:** Optimized routes lead to decreased fuel consumption, lower labor expenses, and diminished vehicle wear and tear.
3. **Enhanced Customer Satisfaction:** Accelerated and dependable deliveries result in greater customer contentment and heightened brand loyalty. Customers receive precise information regarding delivery times and potential delays, resulting in an enhanced overall experience.
4. **Increased Flexibility and Responsiveness:** Dynamic routing allows e-commerce businesses to adjust to fluctuations in demand, delivery locations, and other variables in real time.
5. **Improved Environmental Sustainability:** Decreased fuel consumption and optimized routing lead to a reduced carbon footprint.
6. **Better Resource Utilization:** Dynamic routing optimizes the use of delivery vehicles and drivers, enhancing capacity and reducing idle time.
7. **Scalability:** Dynamic routing effectively accommodates the escalating complexities associated with the expansion of an e-commerce business.

VI. USES OF DYNAMIC ROUTING IN E-COMMERCE FULFILLMENT

Dynamic routing is not universally applicable; instead, it serves as a flexible instrument that can be utilized in multiple facets of e-commerce fulfillment. Below are several specific use cases:

1. **Last-Mile Delivery Optimization:** This represents a significant and evident application. Dynamic routing enhances delivery routes to customers' residences or businesses, facilitating the most rapid and efficient delivery outcomes. Consider it analogous to the concluding phase of a relay race, where each second is critical [9].
2. **Same-Day and On-Demand Delivery:** In the contemporary marketplace, there is a growing expectation among consumers for same-day or on-demand delivery services. Dynamic routing facilitates the continuous adjustment of routes to meet new orders and stringent delivery timelines. Consider the scenario of ordering groceries online, with delivery



occurring within hours due to dynamic routing that optimizes a driver's route to incorporate your order [10].

3. **Multi-Stop Route Optimization:** E-commerce deliveries frequently encompass several stops within a single route. Dynamic routing optimizes the sequence of stops by considering factors such as delivery time windows, traffic conditions, and vehicle capacity. This resembles the process of planning a road trip with several destinations, where the objective is to determine the most efficient route for visiting each location [11].
4. **Returns Management:** Dynamic routing can optimize the process of collecting returns from customers. The system calculates optimal routes for drivers to collect returned items, thereby minimizing time and cost. Consider it as reverse logistics, characterized by the movement of goods from the customer to the warehouse [12].
5. **Crowdsourced Delivery:** Certain e-commerce companies employ crowdsourced delivery models, wherein independent contractors or gig workers are responsible for making deliveries. Dynamic routing facilitates the assignment of deliveries to workers by considering their location, availability, and performance ratings. It functions similarly to a ride-sharing service, but is designed for the transportation of packages [13].
6. **Warehouse to Hub Transfers:** Dynamic routing extends beyond the last mile. This method can optimize the transfer of goods among warehouses, distribution centers, and sorting hubs. This guarantees that inventory is consistently positioned appropriately and timely [14].
7. **Dynamic Slotting in Warehouses:** Dynamic slotting in warehouses involves the application of dynamic routing principles to enhance inventory placement efficiency. The system analyzes order patterns and delivery routes to identify optimal storage locations for specific items, thereby minimizing picking and packing times. This facilitates the optimization of product placement and movement within a warehouse [15].

VII. IMPACT OF DYNAMIC ROUTING ON E-COMMERCE

The implementation of dynamic routing significantly affects multiple stakeholders within the e-commerce ecosystem:

1. Businesses:

- i. **Cost Savings:** Cost savings are achieved through reduced fuel consumption, lower labor costs, and enhanced resource utilization.
- ii. **Increased Efficiency:** Optimized routes and streamlined operations improve overall efficiency, enabling businesses to manage a greater volume of orders with existing resources [16].
- iii. **Competitive Advantage:** Faster and more reliable deliveries confer a competitive advantage in a market where customer experience is critical.
- iv. **Scalability:** Dynamic routing facilitates seamless scalability for businesses, allowing them to accommodate growth without a corresponding rise in logistics complexities.
- v. **Improved Brand Reputation:** Fulfillment of delivery commitments and the provision of a favourable customer experience contribute to enhanced brand reputation and increased customer loyalty.



2. **Customers:**

- i. **Faster Deliveries:** Customers get their orders faster, resulting in increased satisfaction.
- ii. **Reliable Delivery Times:** Dynamic routing enhances the predictability and reliability of delivery times by minimizing the chances of missed delivery windows [17].
- iii. **Improved Communication:** Customers receive real-time updates regarding their delivery status, which alleviates anxiety and increases transparency.
- iv. **Enhanced Convenience:** Enhanced convenience is achieved through features such as on-demand delivery and flexible delivery options, which improve the overall online shopping experience.

3. **Delivery Drivers:**

- i. **Optimized Routes:** Drivers receive the most efficient routes, thereby minimizing driving time and mileage.
- ii. **Reduced Stress:** Real-time updates and optimized routes mitigate traffic and other delays, thereby reducing stress and enhancing job satisfaction for drivers.
- iii. **Increased Earnings:** Optimized routes and enhanced efficiency may result in a higher number of deliveries per shift, thereby potentially augmenting driver earnings.

4. **Environment:**

- i. **Reduced Carbon Footprint:** The optimization of routes and reduction in fuel consumption lead to a diminished carbon footprint, thereby enhancing environmental sustainability.
- ii. **Less Congestion:** Efficient routing can significantly reduce traffic congestion, especially in urban environments.

5. **Society:**

- i. **Economic Growth:** The enhanced efficiency and cost reductions linked to dynamic routing have the potential to drive economic growth within the e-commerce sector.
- ii. **Job Creation:** The expansion of e-commerce and the implementation of advanced technologies such as dynamic routing can generate new employment opportunities in logistics and associated sectors.
- iii. **Improved Urban Planning:** Dynamic routing systems generate data that offers valuable insights for urban planners, facilitating the optimization of infrastructure and traffic management.

VIII. SCOPE OF DYNAMIC ROUTING IN E-COMMERCE

Dynamic routing is anticipated to become increasingly significant in several key areas:

1. **Integration with AI and Machine Learning:** The future of dynamic routing is contingent upon its integration with advanced AI and machine learning algorithms. These technologies will facilitate advanced route optimization, predictive analytics, and real-time decision-making. A system capable of accurately predicting traffic patterns, anticipating customer



needs pre-emptively, and autonomously adjusting delivery routes based on various complex factors is envisioned.

2. **Autonomous Vehicles and Drones:** The increasing prevalence of autonomous vehicles and drones in the delivery sector necessitates the implementation of dynamic routing for effective operational management. A fleet of autonomous delivery vans and drones, coordinated by an adaptive routing system, optimizes their paths to ensure efficient delivery operations.
3. **Hyperlocal Delivery Networks:** The emergence of hyperlocal delivery models, characterized by deliveries within a limited geographic area, will significantly enhance the demand for dynamic routing. These networks will depend significantly on real-time optimization to guarantee rapid and efficient delivery within constrained timeframes.
4. **Omnichannel Fulfillment:** The adoption of omnichannel strategies by retailers necessitates the integration of online and offline sales channels, with dynamic routing being essential for optimizing fulfillment across these various channels. A customer may place an online order and opt for in-store pickup, or a retailer may fulfill an online order from a local store rather than a central warehouse. Dynamic routing is essential for coordinating complex fulfillment scenarios.
5. **Blockchain for Enhanced Transparency and Security:** The integration of dynamic routing with blockchain technology can significantly enhance transparency and security within the supply chain. A system exists in which each phase of the delivery process, from order placement to final delivery, is documented on a secure and immutable blockchain ledger, offering customers comprehensive visibility into the trajectory of their package.
6. **Sustainability Initiatives:** Dynamic routing will increasingly contribute to the ability of e-commerce companies to meet their sustainability objectives. Dynamic routing optimizes routes and reduces fuel consumption, thereby contributing to a reduced carbon footprint and enhancing the environmental sustainability of logistics operations.
7. **Personalized Delivery Experiences:** Future advancements in dynamic routing may facilitate the development of highly personalized delivery experiences. A system enabling customers to select their preferred delivery time, driver, or vehicle type, while maintaining optimal efficiency for the retailer, is proposed.
8. **Global Expansion:** The ongoing growth of e-commerce necessitates dynamic routing for the effective management of intricate international logistics. The system must adapt to varying regulations, infrastructure, and cultural norms across different countries.

IX. CONCLUSION

Dynamic routing signifies a significant change in e-commerce fulfillment, transitioning from inflexible, predetermined processes to a flexible, data-informed, and customer-focused methodology. It provides notable enhancements in delivery speed, cost efficiency, and reliability, thereby improving the overall customer experience. Utilizing real-time data, advanced algorithms, and predictive analytics, dynamic routing enables e-commerce businesses to enhance logistics operations, decrease costs, elevate customer satisfaction, and achieve a competitive advantage.



With technological advancements and evolving consumer expectations, dynamic routing will become increasingly essential in the future of e-commerce. The integration of emerging technologies such as AI and autonomous vehicles will enhance capabilities, leading to more efficient and sustainable delivery solutions.

In conclusion, dynamic routing represents a fundamental shift in the approach to e-commerce logistics rather than just a technological enhancement. Businesses must evolve to succeed in the rapidly changing landscape of online retail. Adopting dynamic routing is crucial for providing both packages and customer satisfaction in the competitive environment of contemporary e-commerce.

REFERENCES

1. G. Berbeglia, et al., "Dynamic traveling salesman problem with stochastic arc costs," *European Journal of Operational Research*, vol. 203, no. 1, pp. 51-61, 2010.
2. N. Boysen, et al., "E-commerce warehousing and distribution: A review," *European Journal of Operational Research*, vol. 277, no. 3, pp. 795-811, 2019.
3. D. Cattaruzza, et al., "Vehicle routing problems for city logistics," *EURO Journal on Transportation and Logistics*, vol. 5, no. 1, pp. 51-79, 2016.
4. L. Chen, et al., "Dynamic routing for urban delivery fleets with customer-centric objectives," *Transportation Research Part E: Logistics and Transportation Review*, vol. 93, pp. 289-310, 2016.
5. C. F. Daganzo, "The distance traveled to visit N points with a maximum of C stops per vehicle: An analytic model and an application," *Transportation Science*, vol. 18, no. 4, pp. 331-350, 1984.
6. R. C. De Oliveira, et al., "A cooperative coevolutionary algorithm for the multi-objective dynamic vehicle routing problem," *Expert Systems with Applications*, vol. 43, pp. 116-130, 2016.
7. J. B. Edwards, et al., "Last mile logistics: Challenges and opportunities for omnichannel retailers," *International Journal of Physical Distribution & Logistics Management*, vol. 40, no. 1/2, pp. 98-121, 2010.
8. M. Gendreau, et al., "A large neighborhood based heuristic for the vehicle routing problem with time windows," *Transportation Science*, vol. 33, no. 4, pp. 375-386, 1999.
9. A. Karak and K. Abdelghany, "The hybrid vehicle-drone routing problem for pick-up and delivery services," *Transportation Research Part C: Emerging Technologies*, vol. 102, pp. 427-449, 2019.
10. J. Kembro, et al., "E-commerce logistics and fulfillment: A research review," *International Journal of Physical Distribution & Logistics Management*, vol. 48, no. 7, pp. 708-732, 2018.
11. A. C. Mckinnon, "The impacts of retail and logistics on the environment," in *Handbook of Logistics and Supply-Chain Management*, A. M. Brewer, et al., Eds., Pergamon, 2001, pp. 449-465.
12. V. Pillac, et al., "A review of dynamic vehicle routing problems," *European Journal of Operational Research*, vol. 225, no. 1, pp. 1-11, 2013.
13. H. N. Psaraftis, "Dynamic vehicle routing: Status and prospects," *Annals of Operations Research*, vol. 61, no. 1, pp. 143-164, 1995.



14. M. W. P. Savelsbergh and M. Sol, "The general pickup and delivery problem," *Transportation Science*, vol. 29, no. 1, pp. 17-29, 1995.
15. M. W. Ulmer, et al., "Dynamic pricing and routing for same-day delivery," *Transportation Science*, vol. 54, no. 1, pp. 150-167, 2020.
16. T. Vidal, et al., "Heuristics for multi-attribute vehicle routing problems: A survey and synthesis," *European Journal of Operational Research*, vol. 231, no. 1, pp. 1-21, 2013.
17. X. Wang, et al., "A survey on the vehicle routing problem and its variants," *Computers & Industrial Engineering*, vol. 156, 2021, Art. no. 107238.