

Population-Scale Intelligence: The Future of Digital Public Infrastructure

MIT LPM and Beckn Protocol

A. The Platform Paradox

Digital platforms have fundamentally reshaped society's fabric, moving far beyond mere convenience to become critical infrastructure that shapes how we live, work, and interact. Every day, billions of people coordinate through digital systems: 500 million payments are settled, 200 million ride-hailing trips are completed, and 80 million parcels find their way home. The success of this digital transformation is evident in how platform names have become verbs – we "Uber" to parties, "Venmo" for tickets, "Doordash" our dinners.

Their impact runs deeper than individual transactions. These networks have revolutionized fundamental societal patterns: reshaping food consumption habits through delivery platforms, transforming employment through the gig economy, and altering energy usage through shared mobility. The "network economy" has become central to public health, economic opportunity, and social mobility.

Yet paradoxically, as these systems become more critical to society, our ability to understand and guide their effects diminishes. Initially promising convenience and efficiency, many platforms have evolved from innovation engines to extraction mechanisms. Ride-sharing now often costs more than traditional taxis, payment apps charge higher fees than banks, and delivery services capture larger margins than the restaurants they serve. Locked within proprietary platforms, the data and insights that could inform better policy and societal outcomes remain inaccessible. This transition from "attract" to "extract" isn't just about economics – it represents a deeper question about the future of digital infrastructure.

The answer lies not in better platforms, but in a fundamental shift toward open protocols enhanced by population-scale intelligence. Just as the internet's core protocols enabled an explosion of innovation without centralized control, a new generation of open protocols is transforming how we coordinate at scale. India's Unified Payments Interface (UPI) processes over 9 billion transactions monthly – more than any proprietary platform. The Beckn protocol extends this model beyond payments, creating open networks for commerce, mobility, and public services. These successes demonstrate the first phase of protocol-driven transformation: enabling efficient, accessible transactions without platform intermediaries.

However, achieving efficient transactions is only the first step. The greater challenge lies in understanding and guiding the collective behavior these networks enable. As billions of individuals coordinate through open protocols, we need new ways to understand these

interactions and their societal impact. This requires not just better transaction networks, but a fundamental advance in how we process and learn from population-scale behavior. Large Population Models [1] will build this intelligence layer of DPI.

B. Beyond Transactions: The Need for Population-Scale Intelligence

Today's challenges extend far beyond enabling efficient transactions. The emerging landscape of open protocols reveals both tremendous opportunity and a crucial challenge. Consider three examples from India's digital public infrastructure:

Namma Yatri demonstrates how open protocols can enable efficient ride-sharing without platform intermediaries. Yet optimizing citywide mobility requires understanding broader patterns: Where should EV charging stations be located? When should drivers charge their vehicles? How do individual trip decisions aggregate into traffic patterns? These questions cannot be answered through transaction data alone - they require understanding and guiding collective behavior at scale.

The Open Network for Digital Commerce (ONDC) is decentralizing supply chains through open protocols. During the COVID-19 pandemic, such protocols could have transformed vaccine distribution by enabling efficient cold-chain tracking. However, optimal vaccine distribution requires more than supply chain visibility - it demands understanding complex patterns of disease spread and vaccine hesitancy across populations. A transaction layer alone cannot capture these dynamics or guide strategic distribution decisions.

Similarly, The Unified Energy Interface (UEI) will enable peer-to-peer energy trading, but this is only the beginning. In energy markets, enabling direct solar trading isn't enough - we must understand how millions of consumption and generation decisions collectively affect grid stability and resource distribution. Ensuring reliable power requires anticipating demand spikes, managing intermittent renewable sources, and dynamically adjusting grid parameters across interconnected networks. This demands insights far beyond individual transaction data.

These challenges reveal a crucial opportunity for digital infrastructure. While open protocols excel at enabling individual transactions, they lack native mechanisms for population-scale coordination. Creating truly effective digital public infrastructure requires combining efficient transaction protocols with systems that can understand and guide collective behavior at population scale. This requires a new layer of intelligence built atop open protocols.

C. Large Population Models: The Intelligence Layer of Digital Infrastructure

Large Population Models (LPMs) [1] represent a fundamental advance in how we approach collective intelligence. Rather than training on static datasets, LPMs learn from and optimize dynamic protocols that govern interactions. Through differentiable agent-based simulations, they maintain end-to-end gradients across millions of simulated agents while preserving privacy and computational tractability. The innovation lies in creating a two-layer protocol stack:

Layer 1 (Transaction Layer) consists of physical networks enabling real-time transactions – the UPIs and Bechn protocols of the world. These protocols handle the fundamental mechanics of peer-to-peer interaction, ensuring security, privacy, and basic functionality.

Layer 2 (Orchestration Layer), powered by LPMs, provides population-scale simulation and coordination capabilities. This layer doesn't replace or modify base protocols but enhances them through sophisticated coordination mechanisms. By maintaining differentiability across both simulated and physical agents, LPMs can discover and implement effective coordination strategies while preserving the decentralized nature of underlying protocols.

D. Real-World Applications: Individual and Population

When these layers work in concert, they create remarkable new possibilities for solving complex coordination challenges - at both individual and societal levels.

Synchronized activity of L1-L2 systems will improve the efficiency of local transactions. For instance, in UEI, while L1 protocols enable peer-to-peer energy trading, L2 will optimize grid stability and incentive structures dynamically. Similarly, In Namma Yatri, while L1 protocols enable peer-to-peer mobility, L2 can guide infrastructure development (eg: where EV stations?)

Perhaps the most transformative potential of this two-layer architecture lies in its ability to enable what we might call the "**living census**" – a real-time, granular understanding of societal dynamics that was previously impossible. Traditional censuses, conducted once per decade through manual surveys, provide crucial but limited snapshots of society. The combination of open protocols and population-scale intelligence offers a revolutionary alternative.

Layer 1 protocols generate continuous, privacy-preserving data about real economic and social interactions – from mobility patterns to economic transactions to service access. Layer 2 LPMs can process this data through sophisticated simulations, creating dynamic models of societal behavior while preserving individual privacy. This enables:

- Real-time Insight: Understanding societal changes as they happen, not years later
- Granular Analysis: Identifying patterns at neighborhood and community levels
- Dynamic Response: Testing potential interventions in simulation before deployment

- Active Learning: Continuously updating models based on actual outcomes
- Privacy-Preserving Intelligence: Generating population-level insights without compromising individual data

For example, by analyzing patterns in mobility protocols, payment networks, and service access, we could understand how economic opportunities vary across regions and demographics in real-time. During crises like pandemics or natural disasters, this system could provide immediate insight into community needs and resource distribution. Most importantly, because this intelligence layer builds on open protocols, these insights become a public good – available to policymakers, researchers, and communities themselves.

This vision of a "living census" represents more than just better measurement – it enables a fundamental shift in how we understand and respond to societal needs. Rather than making decisions based on outdated snapshots, we can develop dynamic, evidence-based policies that adapt to real-world conditions while preserving individual privacy and agency.

E. Vision: A New Era of Digital Public Infrastructure

The combination of open protocols and population-scale intelligence points toward a fundamentally new model of digital public infrastructure – one that is simultaneously open yet coordinated, decentralized yet efficient, local yet globally connected. This approach could help address some of society's most pressing coordination challenges while preserving individual agency and privacy.

The future of digital infrastructure lies not in better platforms, but in intelligent protocols that enable effective coordination at unprecedented scales. Through careful development of both protocol networks and LPMs, we can create systems that help humanity address its most pressing challenges while maintaining the openness and innovation that drove the internet's initial success.

References:

1. Large Population Models: lpm.media.mit.edu/agentive_draft.pdf