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Cities at Scale

Scheduling Street Life on a Budget

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#GDC22



Sandy MacPherson

- Senior AI Systems Developer
- Been in games for 10+ years



MADWORLD



CARBONATED



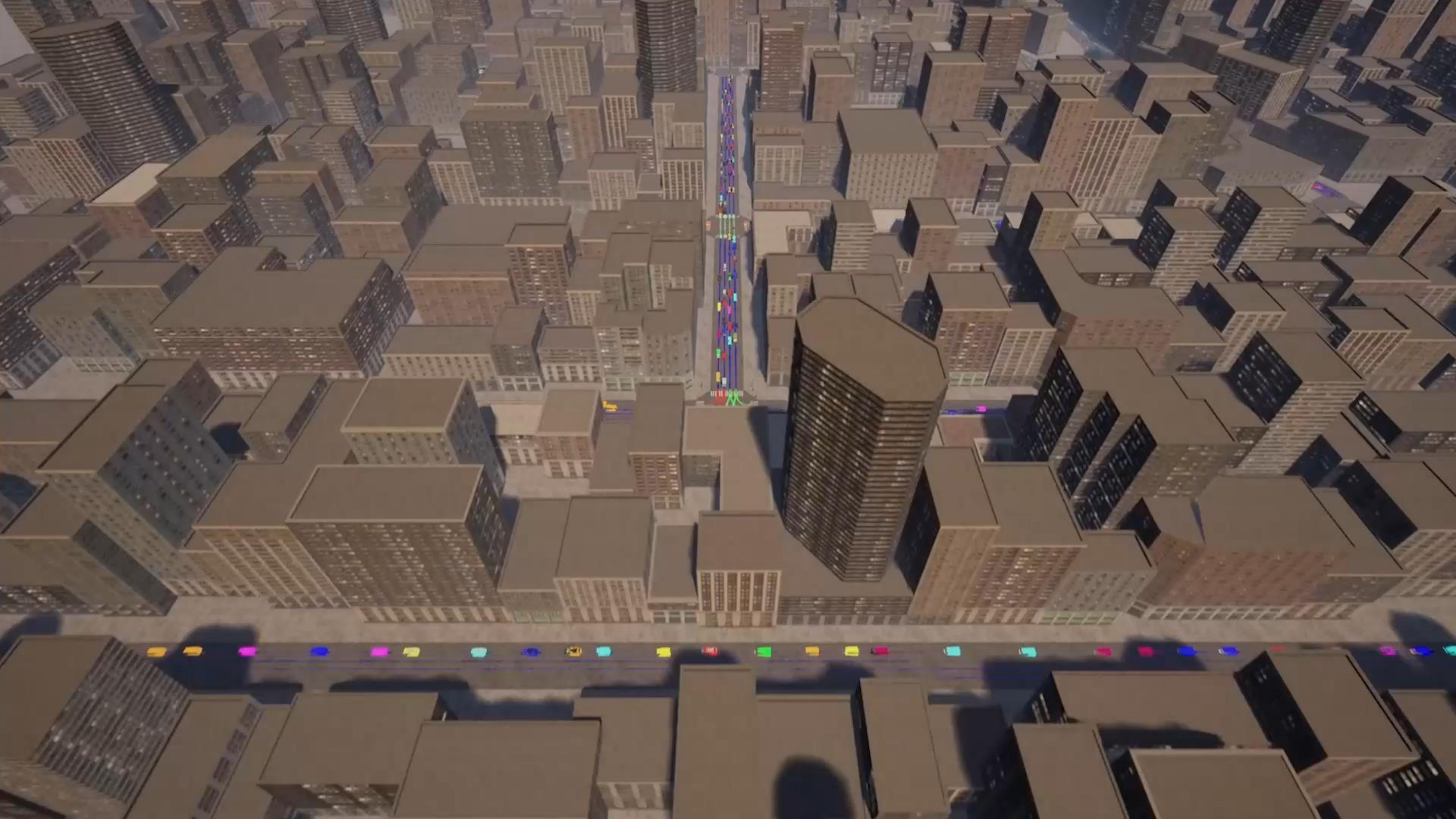
Dedicated to our friends at FragLab, Kyiv, Ukraine



Introduction

- City-scale simulation of ambient traffic
- Populate city environment with vehicles and pedestrians





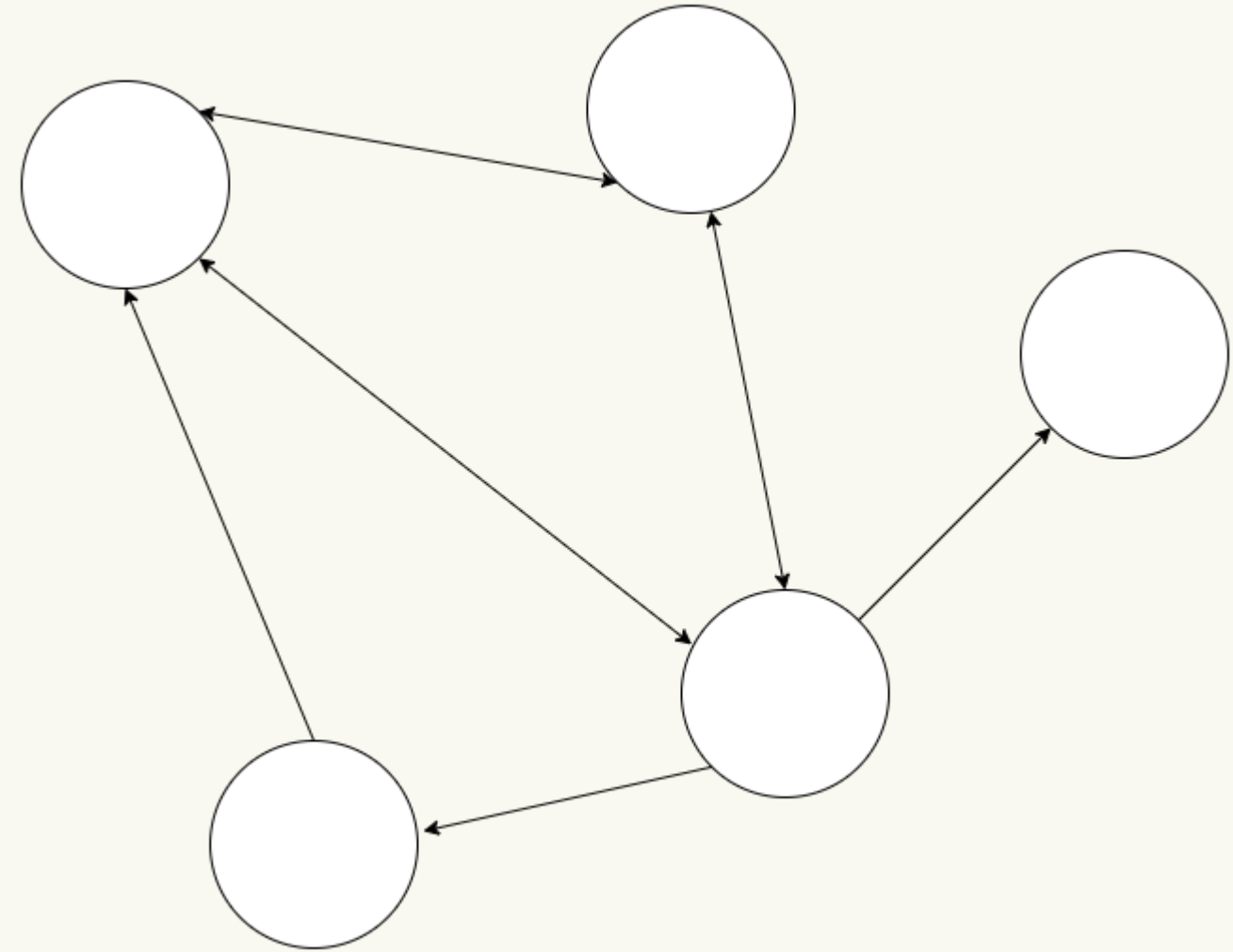
Introduction

- City-scale simulation of ambient traffic
- Populate city environment with vehicles and pedestrians
- Focus on vehicles



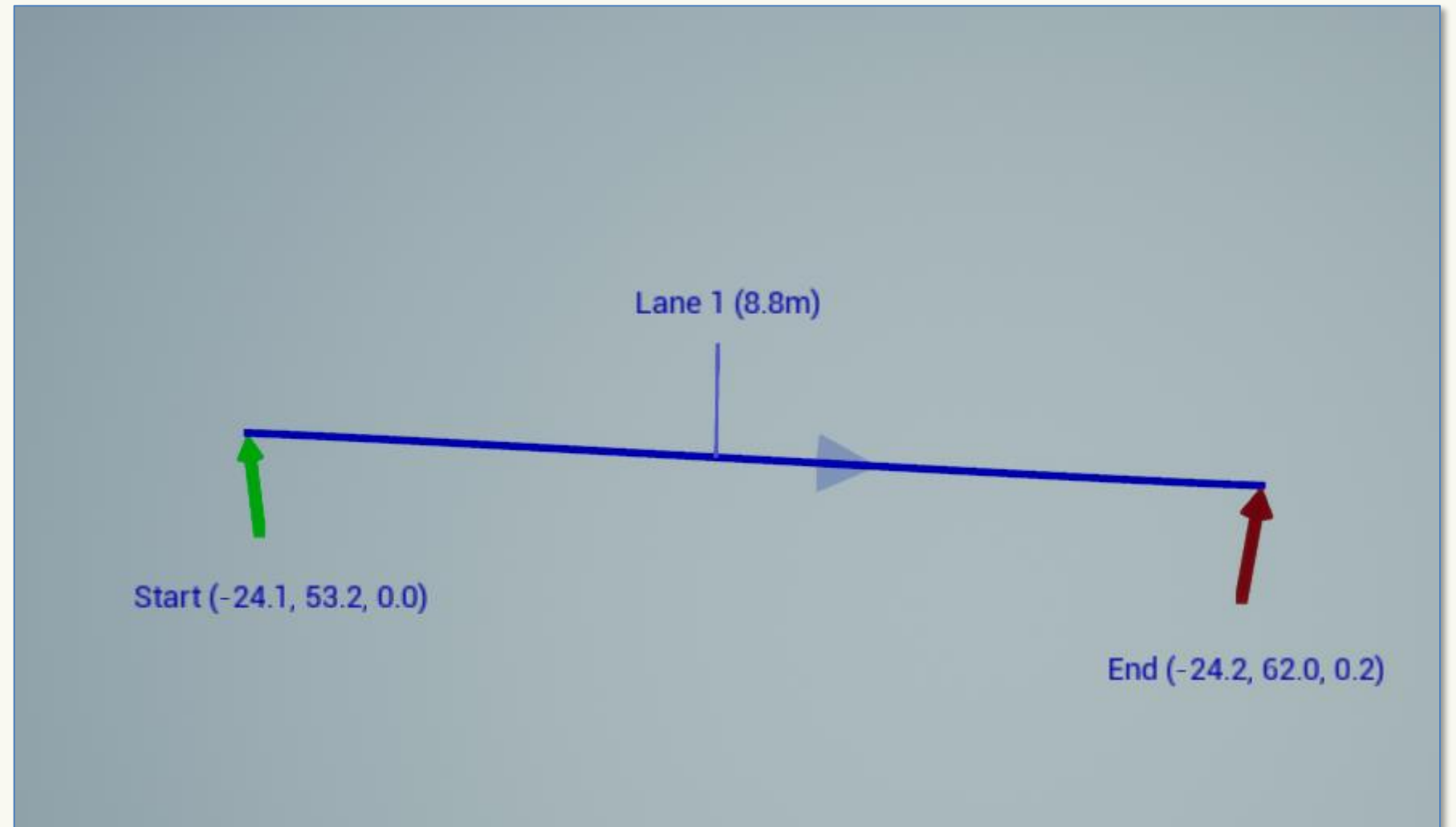
Road Graph

- Structure
 - Essentially a directed graph



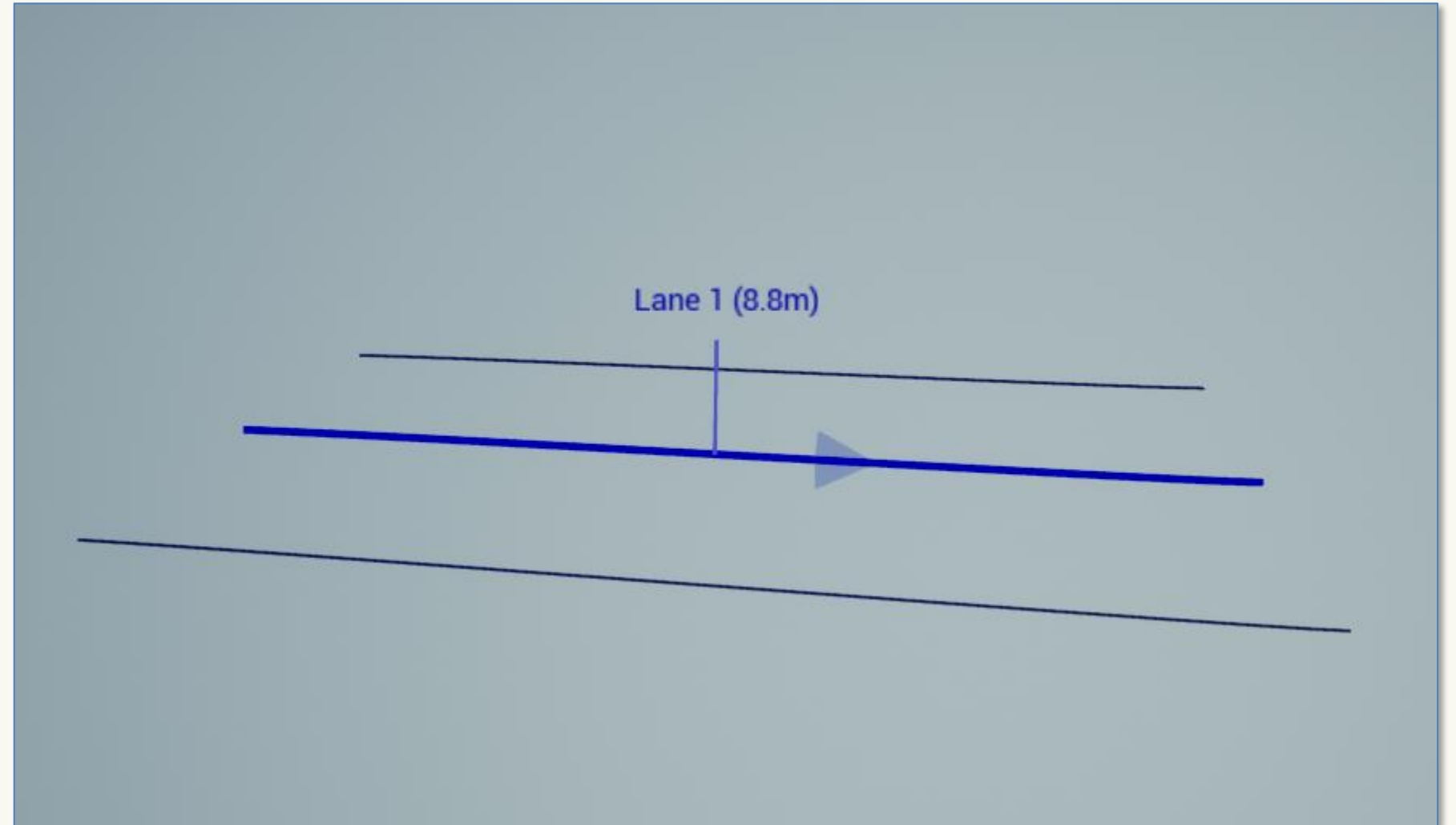
Road Graph

- Structure
 - Essentially a directed graph
 - Lanes are corridors



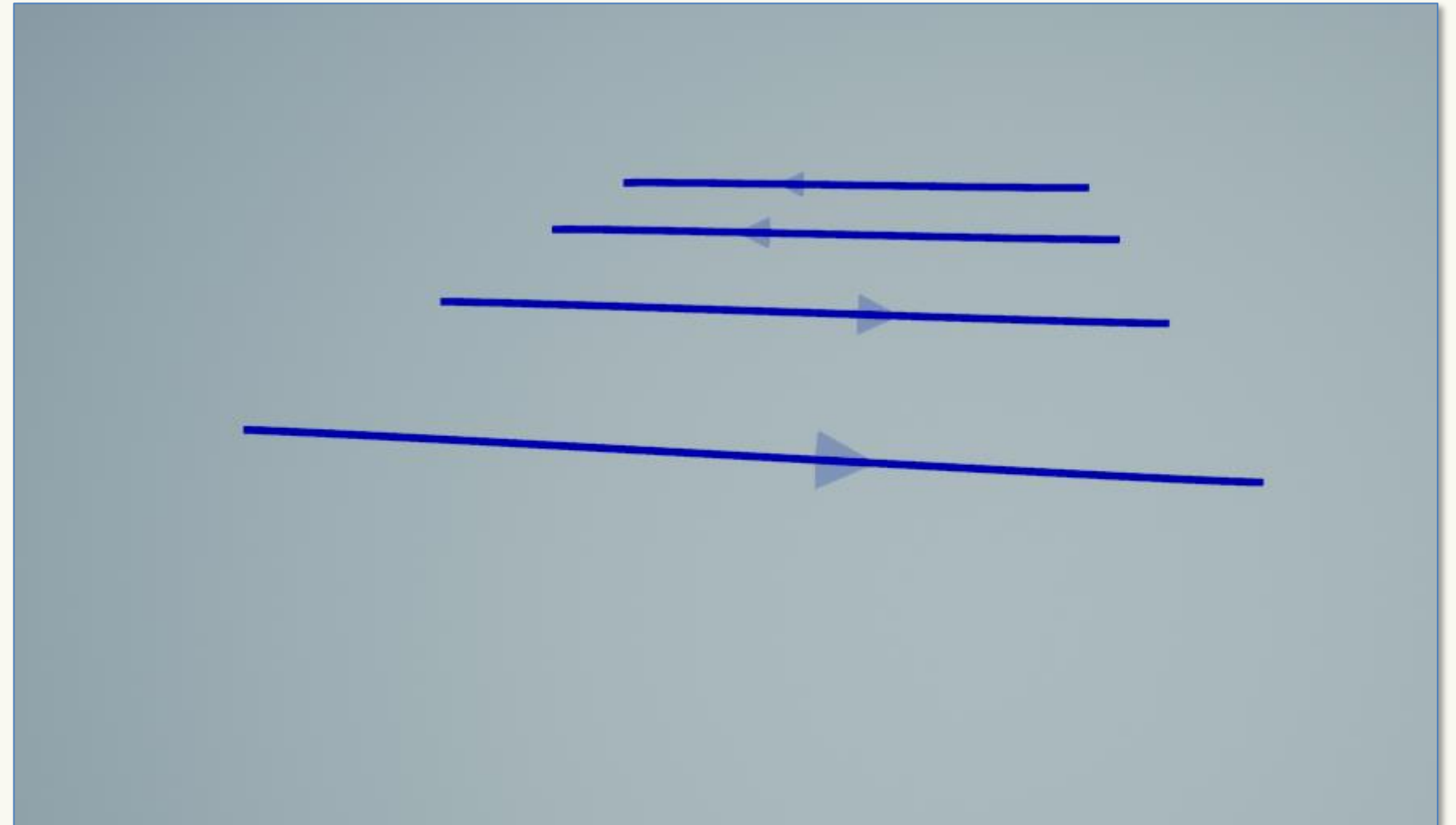
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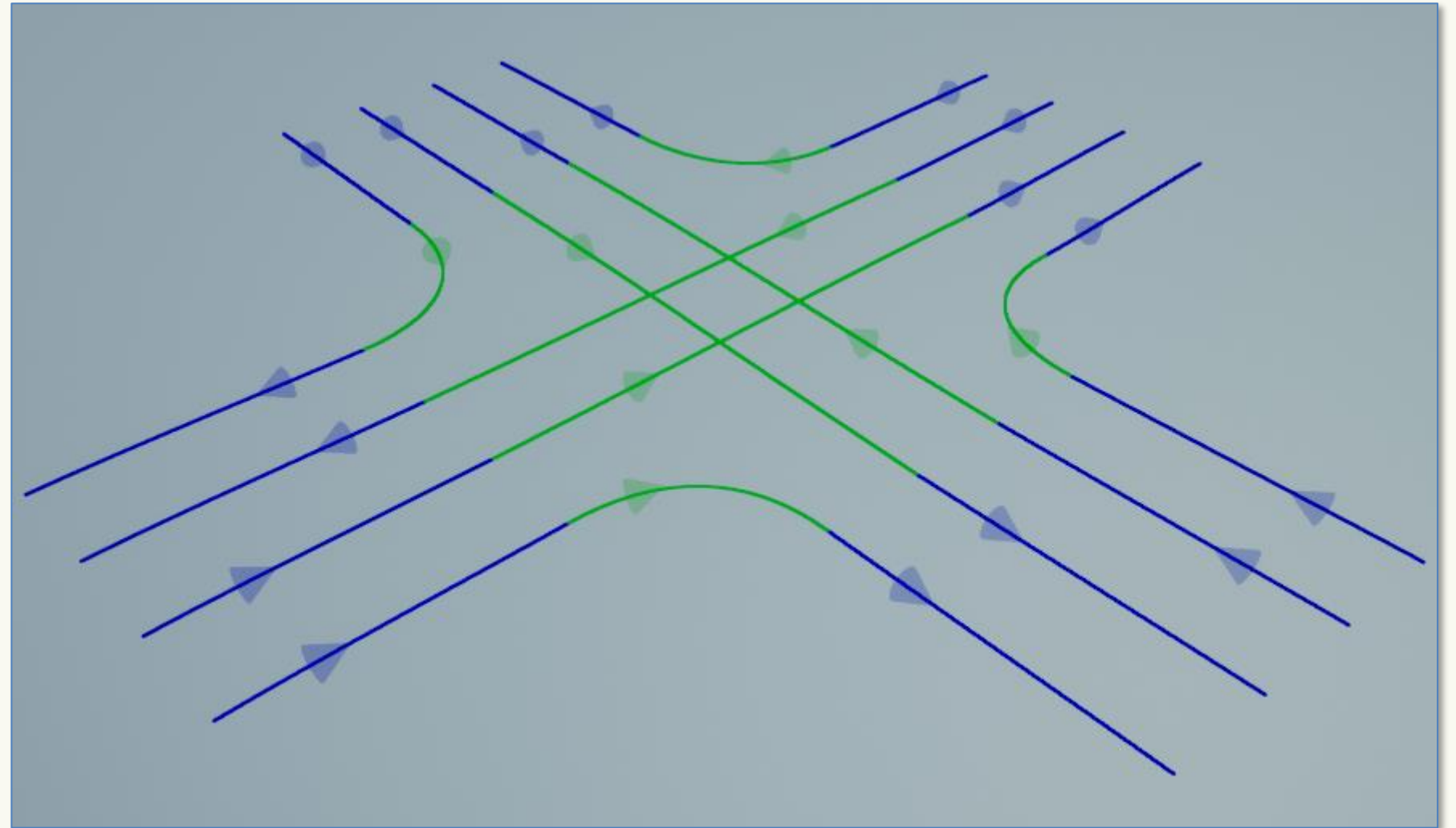
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 - Lanes grouped into roads



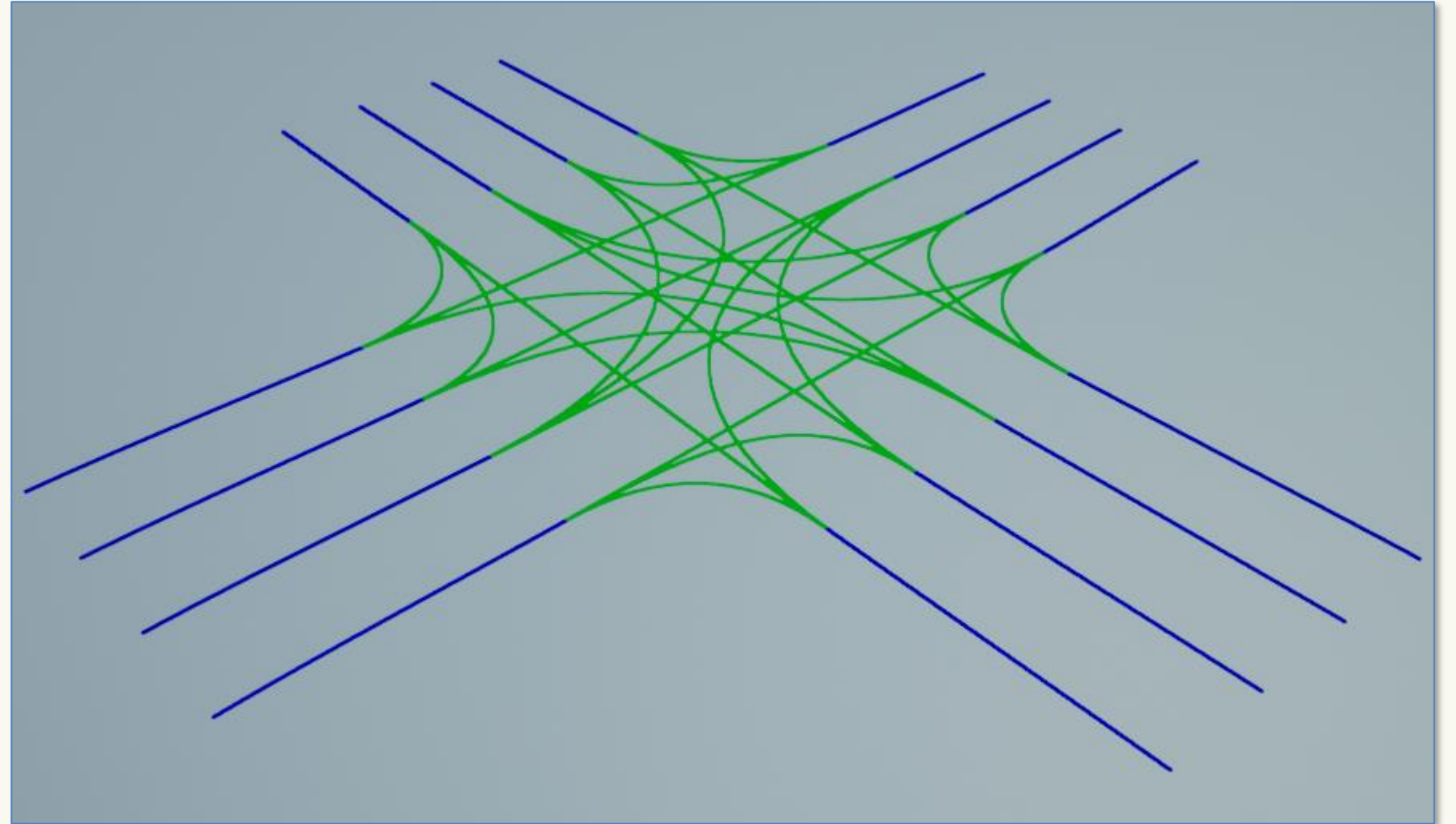
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 - Essentially a directed graph
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 - Lanes grouped into roads
 - Roads connected by intersections



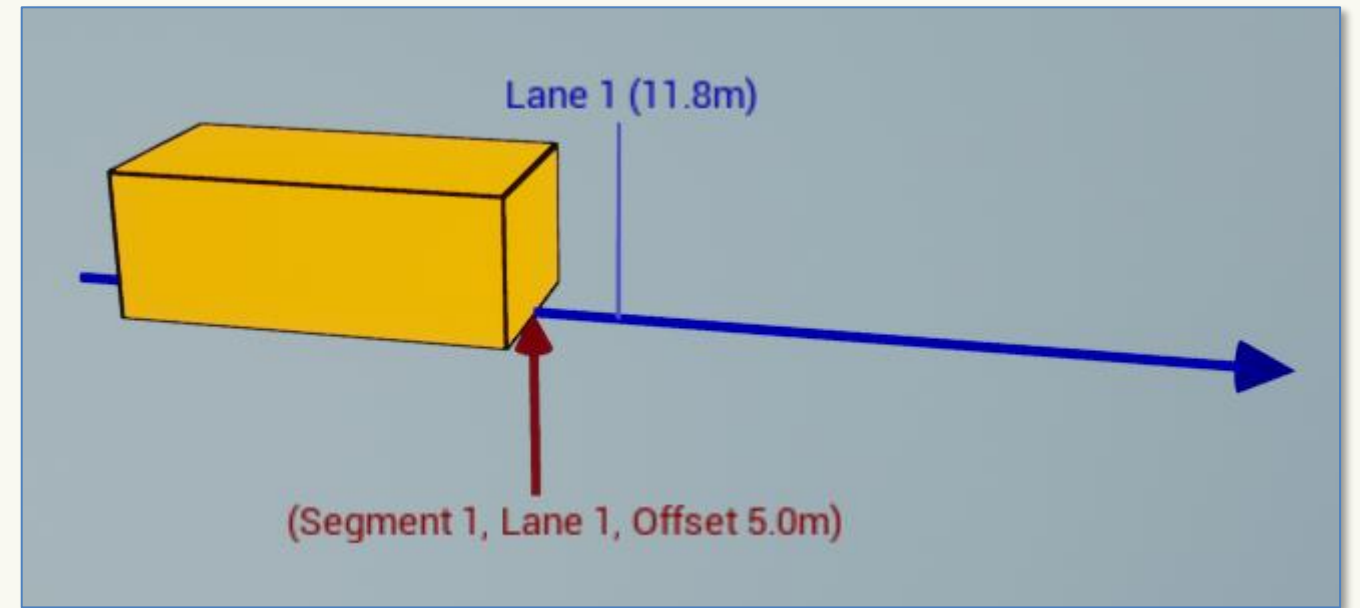
Road Graph

- Structure
 - Essentially a directed graph
 - Lanes are corridors
 - Lanes grouped into roads
 - Roads connected by intersections
 - We call them “segments”
- Many additional features
 - Traffic signals, parking
 - Sidewalks, crosswalks, paths



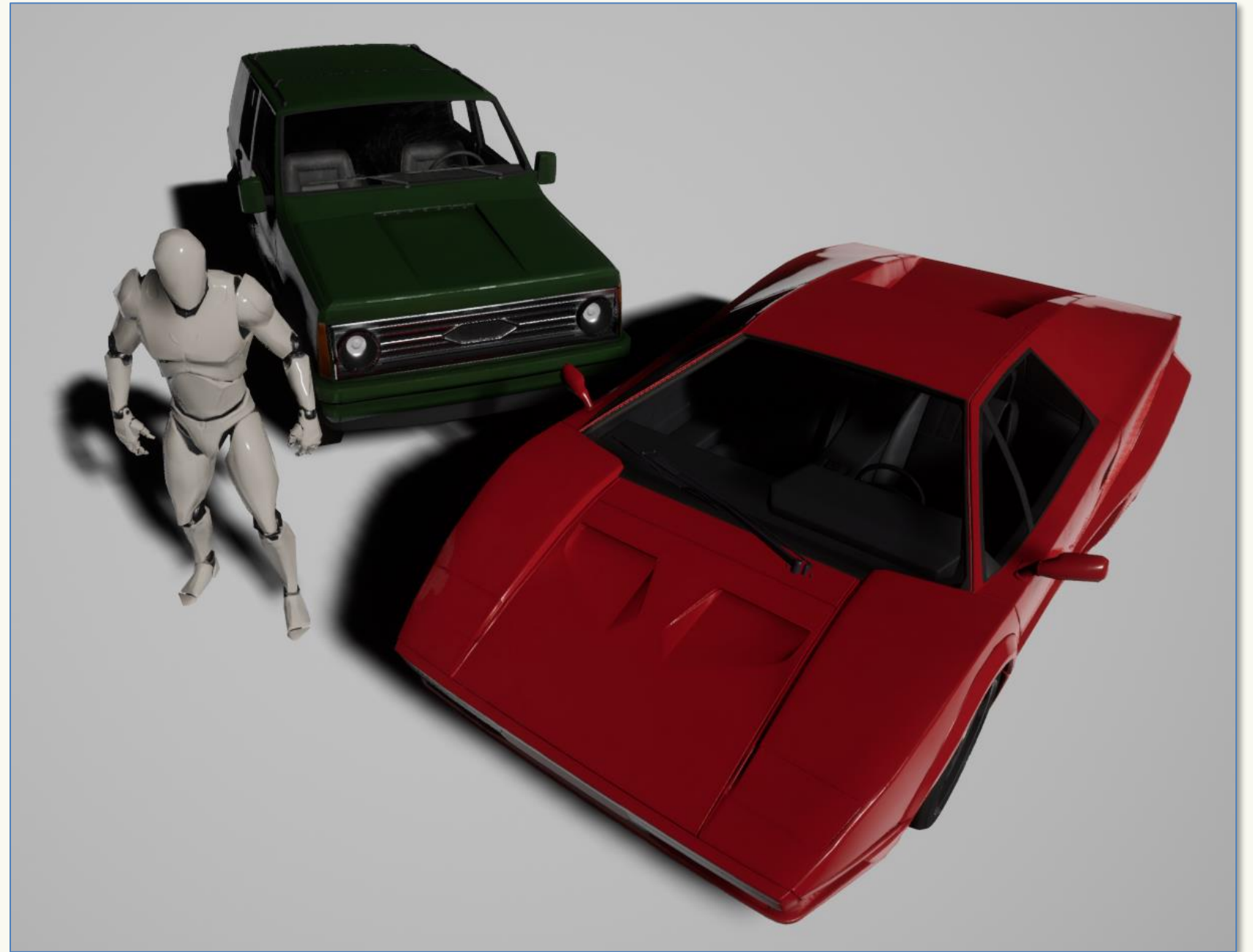
Positions in Road Space

- Position is lane offset
 - (SegmentID, LaneID, Offset) tuple
 - Simplifies math to one dimension, easy Newton's Laws of Motion
- World space
 - Internally we rarely use world space
 - Easy conversions from road to world space, and vice versa



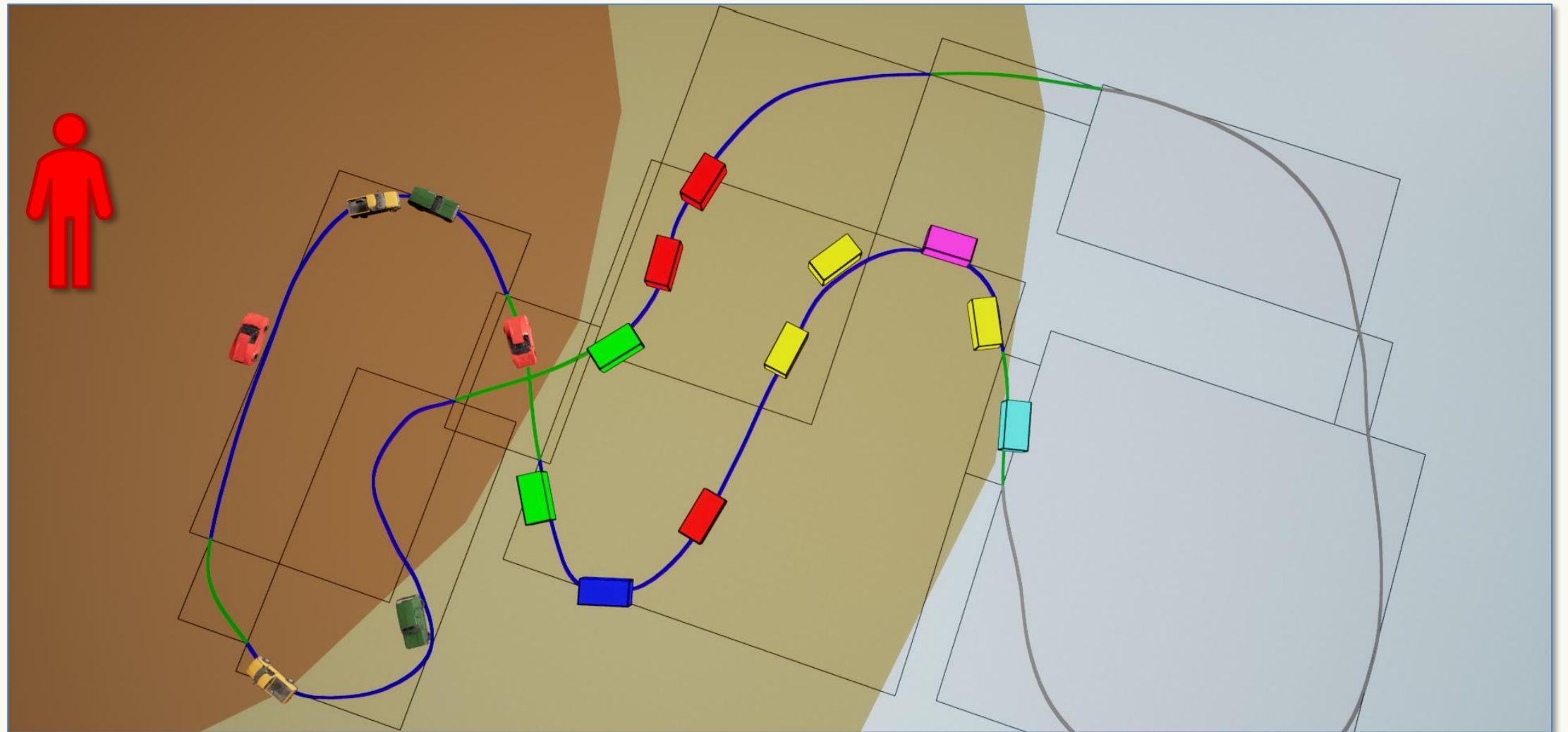
Agent Types and Archetypes

- Vehicles and pedestrians
- IDs map to game entities
- Agents have archetypes
 - Physical size
 - Max speed and acceleration
 - Personality type



Levels of Detail

- Essential for managing large scale agent numbers
- Applied at segment level
- Uses
 - Persistence
 - Spawning
 - Cheating
 - Quality gradient



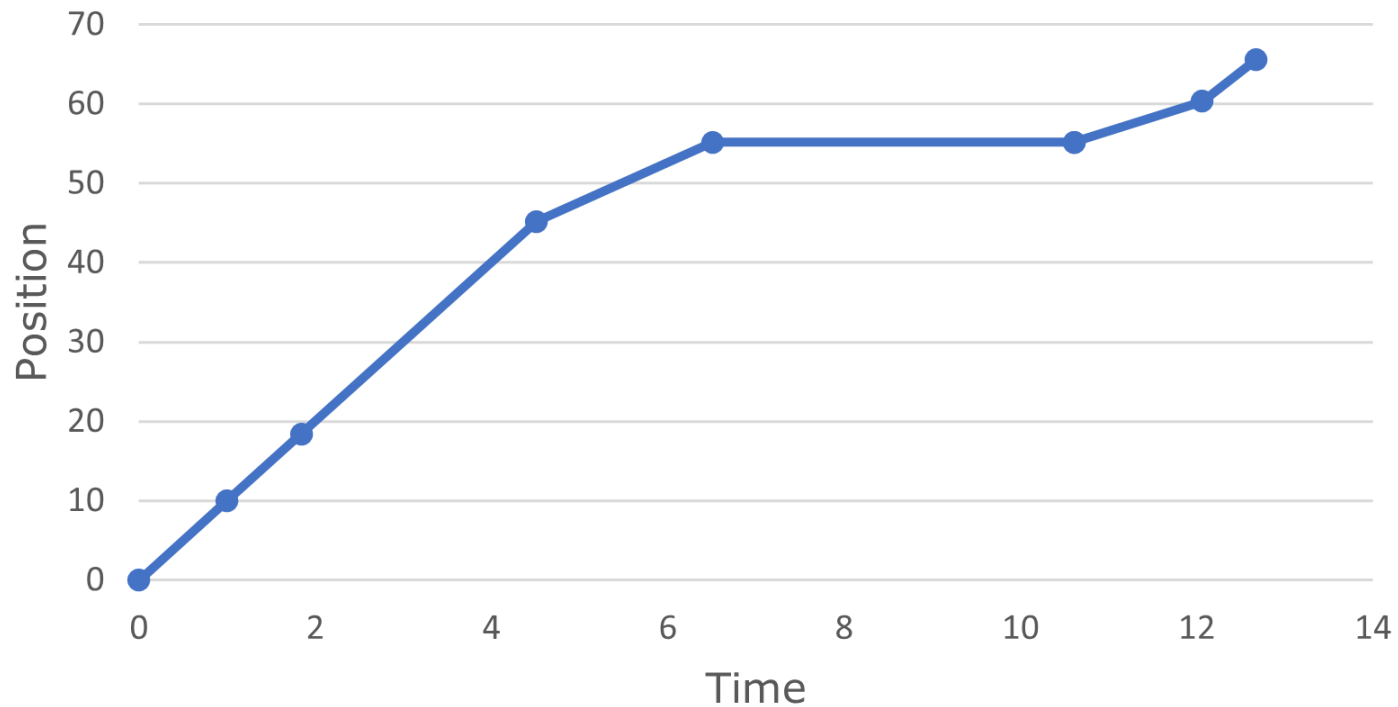
Scheduling

- Rather than process every frame, build a schedule
- Maintain 5-10s of schedule for every agent
- Sequence of keyframes – [time, position, speed]

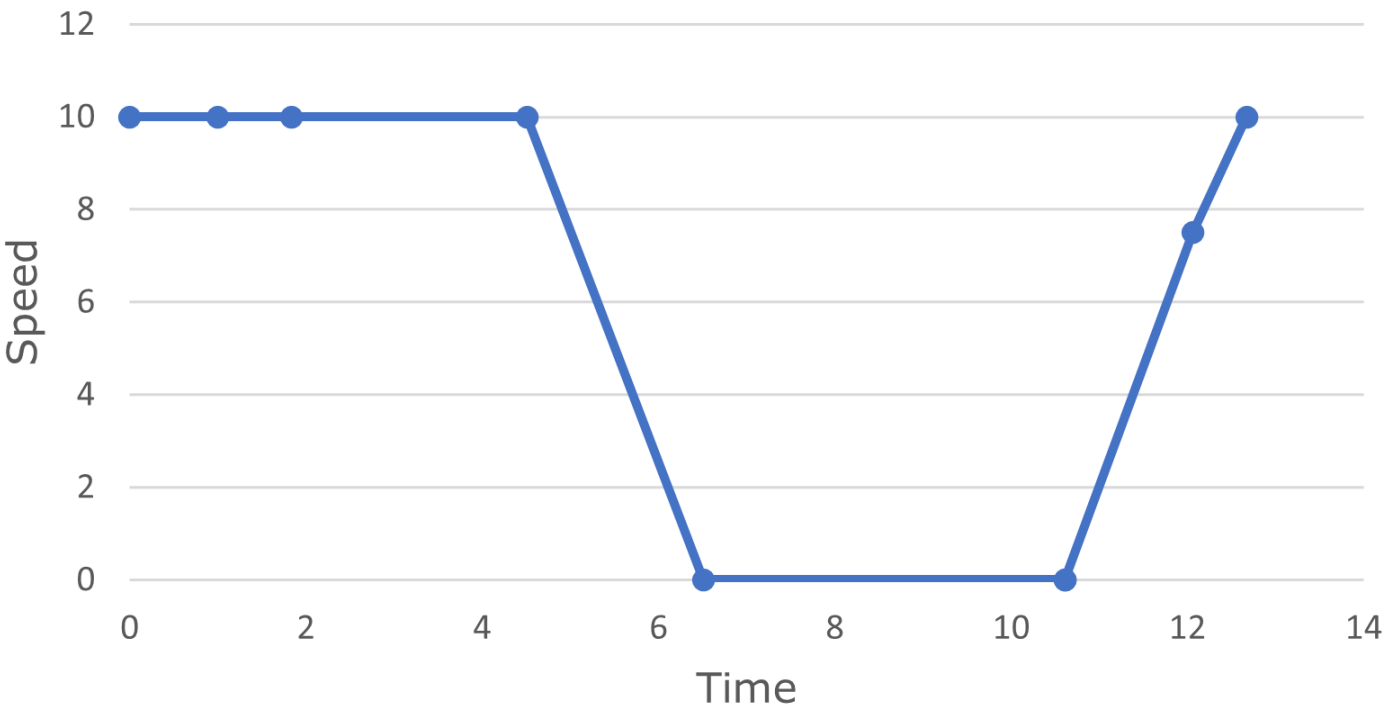
Scheduling

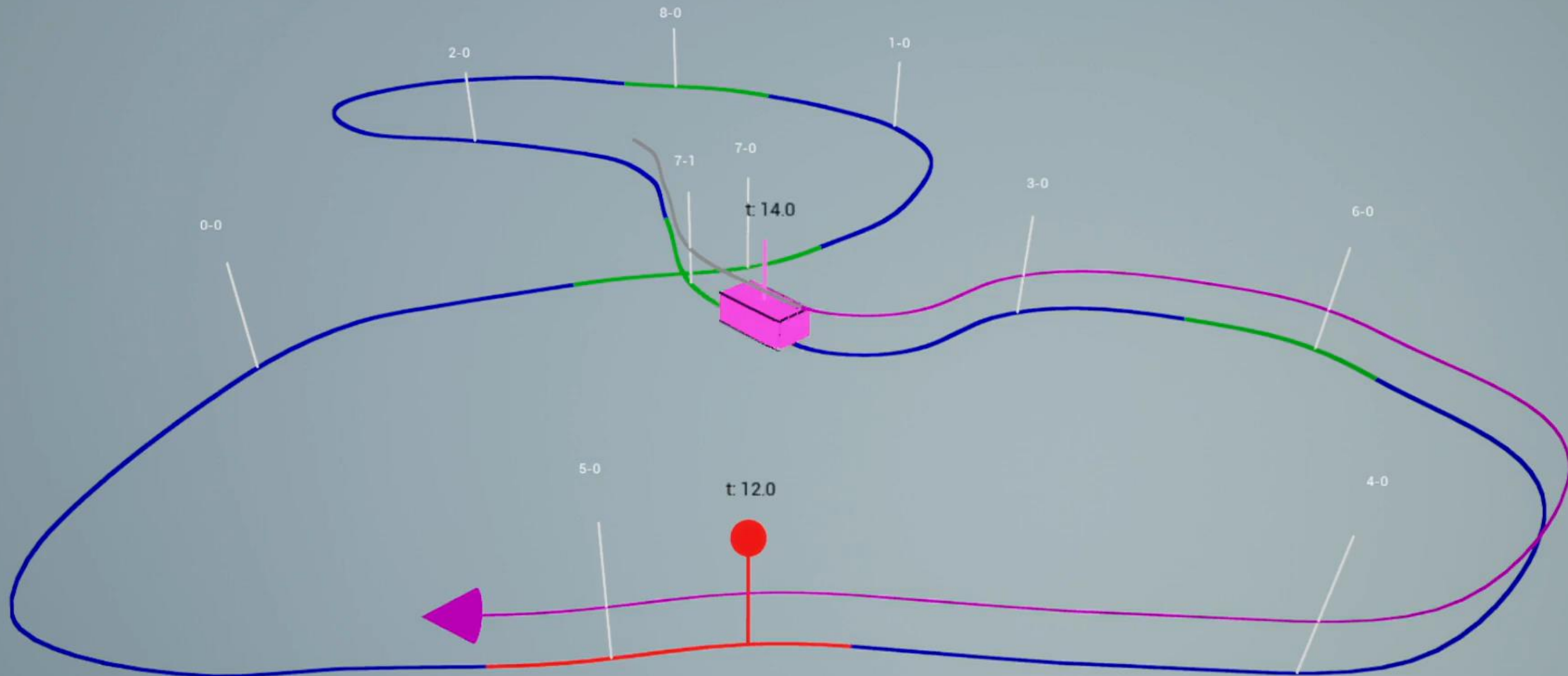
[0]	t = 4.39	Pos: 3/0/0 @ 14.04m	Speed = 10m/s	Distance = 14.04m
[1]	t = 5.39	Pos: 6/0/0 @ 0m	Speed = 10m/s	Distance = 10m
[2]	t = 6.23	Pos: 4/0/0 @ 0m	Speed = 10m/s	Distance = 8.44m
[3]	t = 8.9	Pos: 4/0/0 @ 26.72m	Speed = 10m/s	Distance = 26.72m
[4]	t = 10.9	Pos: 4/0/0 @ 36.72m	Speed = 0m/s	Distance = 10m
[5]	t = 15	Pos: 4/0/0 @ 36.72m	Speed = 0m/s	Distance = 0m
[6]	t = 15	Pos: 5/0/0 @ 0m	Speed = 0m/s	Distance = 0m
[7]	t = 16.45	Pos: 5/0/0 @ 5.25m	Speed = 7.25m/s	Distance = 5.25m
[8]	t = 17.06	Pos: 0/0/0 @ 0m	Speed = 10m/s	Distance = 5.25m

Position over Time



Speed over Time





Scheduling

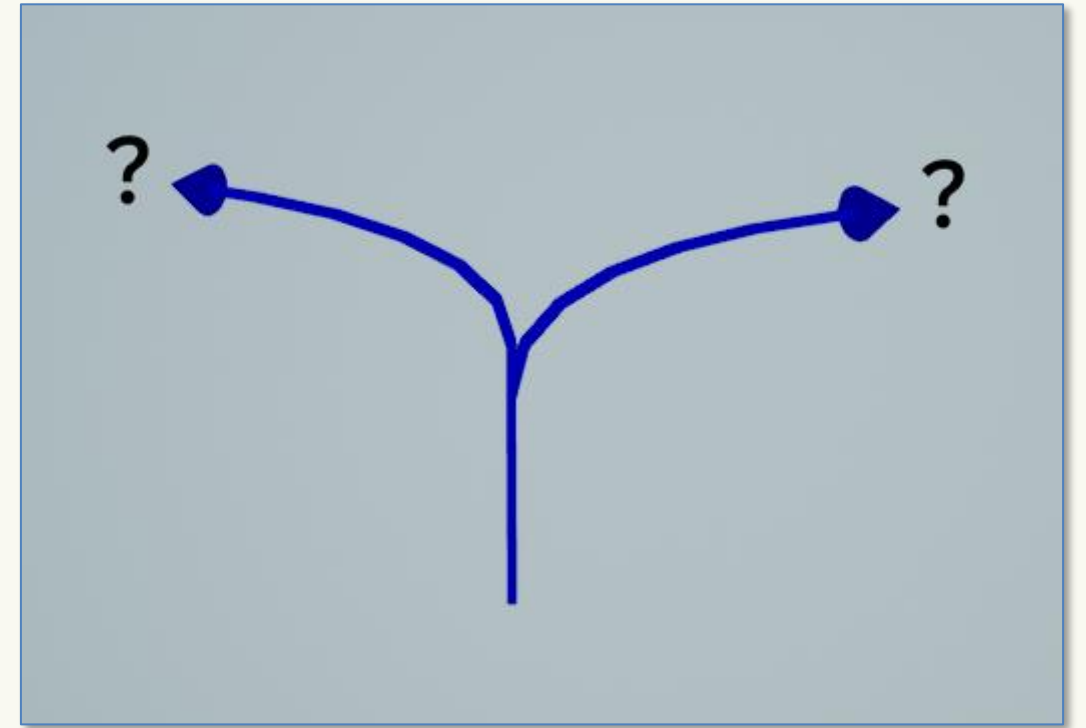
- Order of scheduling is arbitrary on segment level
- Schedule lanes front-to-back
- Schedules generally invariant under level of detail
 - Interpretation can vary with LOD
 - Lane changing is an exception

Why Scheduling?

- Sparse data representation
- Simple 1-D model, easy to apply Newton's Laws of Motion
- Significantly fewer calculations (done per keyframe, not per update)
- Predict future motion accurately and cheaply
- Scheduling can be time-sliced and load-balanced
- Building schedules is decoupled from using them, so could be done on a separate core or offloaded to the cloud
- Send schedules instead of transforms over the network

Lane Selection

- Passive vehicles drive aimlessly around
- Weighted random choice for next lane
 - Presence of queues of traffic
 - Turning across intersections
 - Lane priorities
 - Game flags like temporarily closing roads
 - Heat maps
- Path following

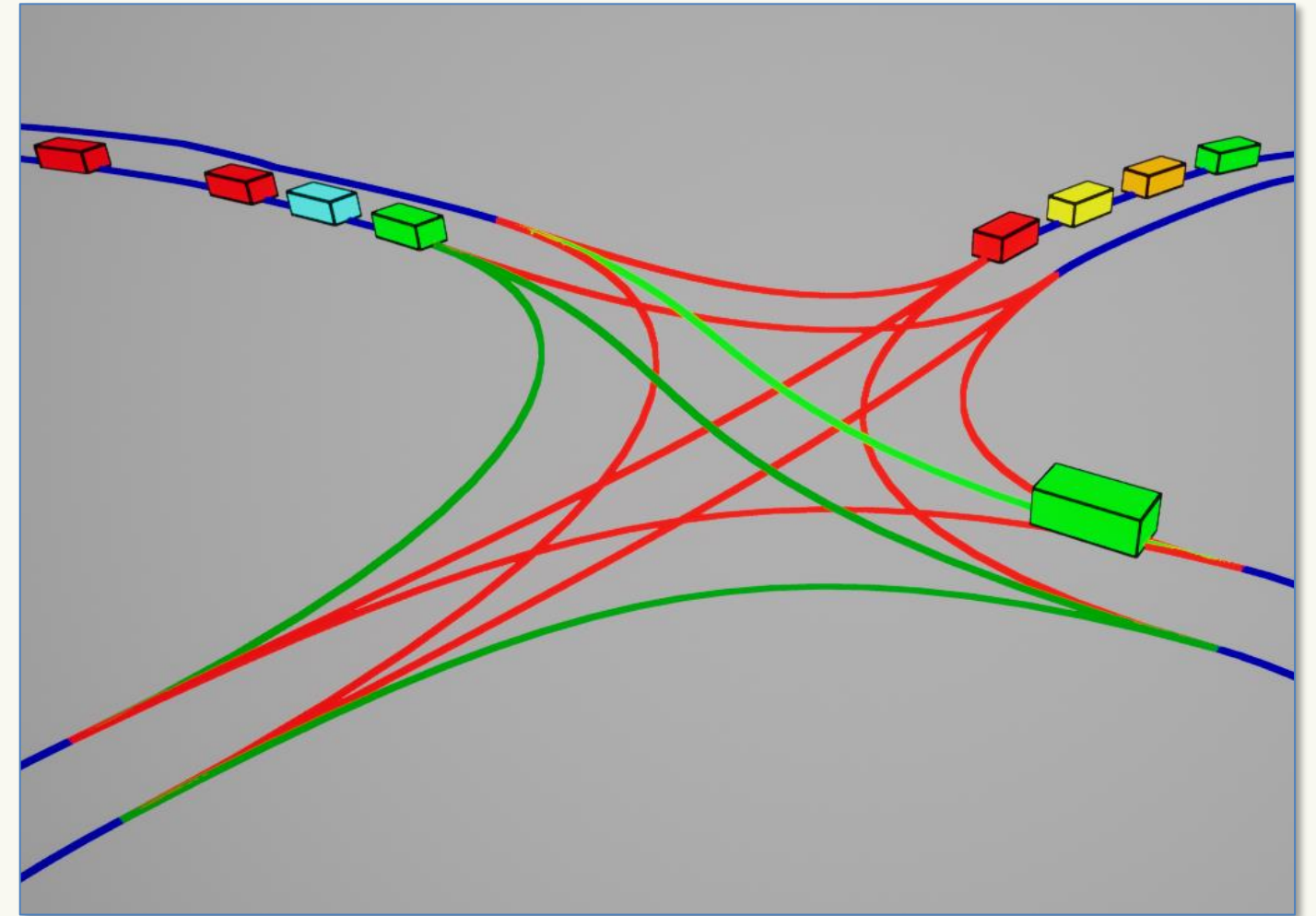


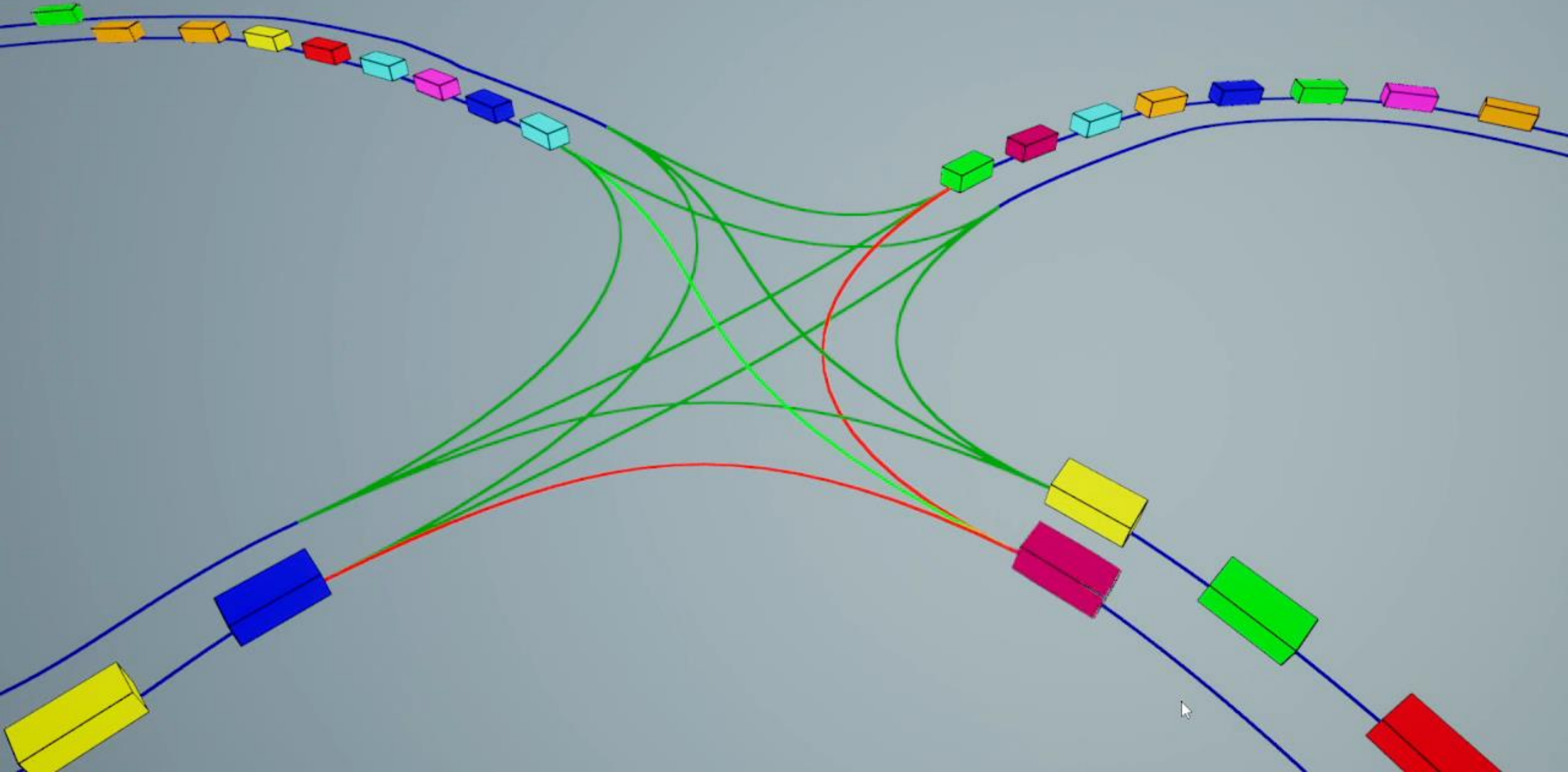
Where (and when) is everybody?

- Schedules describe motion over time
- Lanes hold references to agents, in order
- This information is useful for finding nearby vehicles
 - Find the vehicle in front
 - Look for a gap to change lanes
 - Merge into traffic and enter intersections

Lane Locking

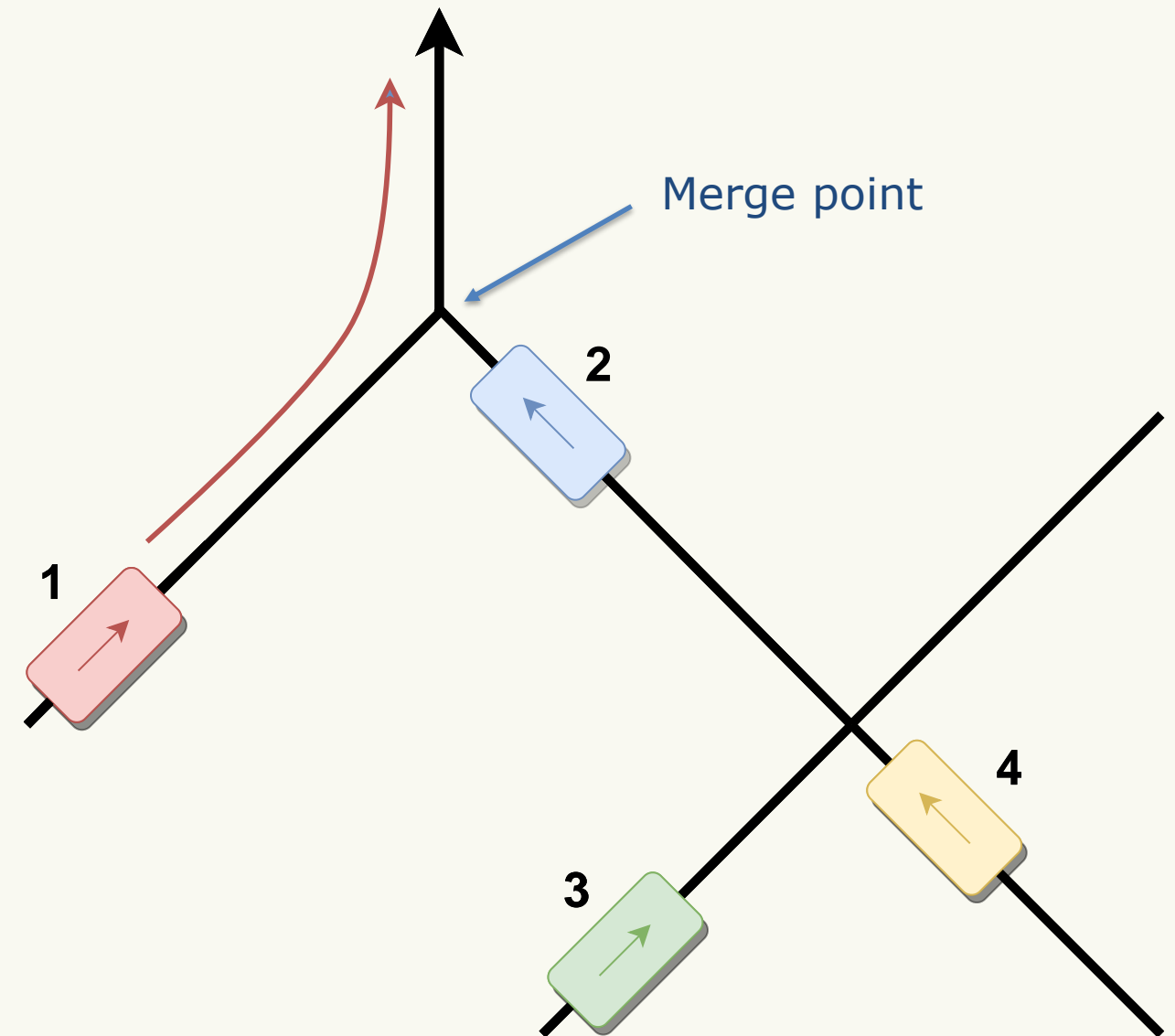
- Intersecting, merging, forking lanes
- Primary vs secondary locks
- Vehicles take and release locks as part of scheduling
- Locking is currently at lane granularity, but could be extended to portions of lanes, allowing for increased traffic flow
- Traffic signals





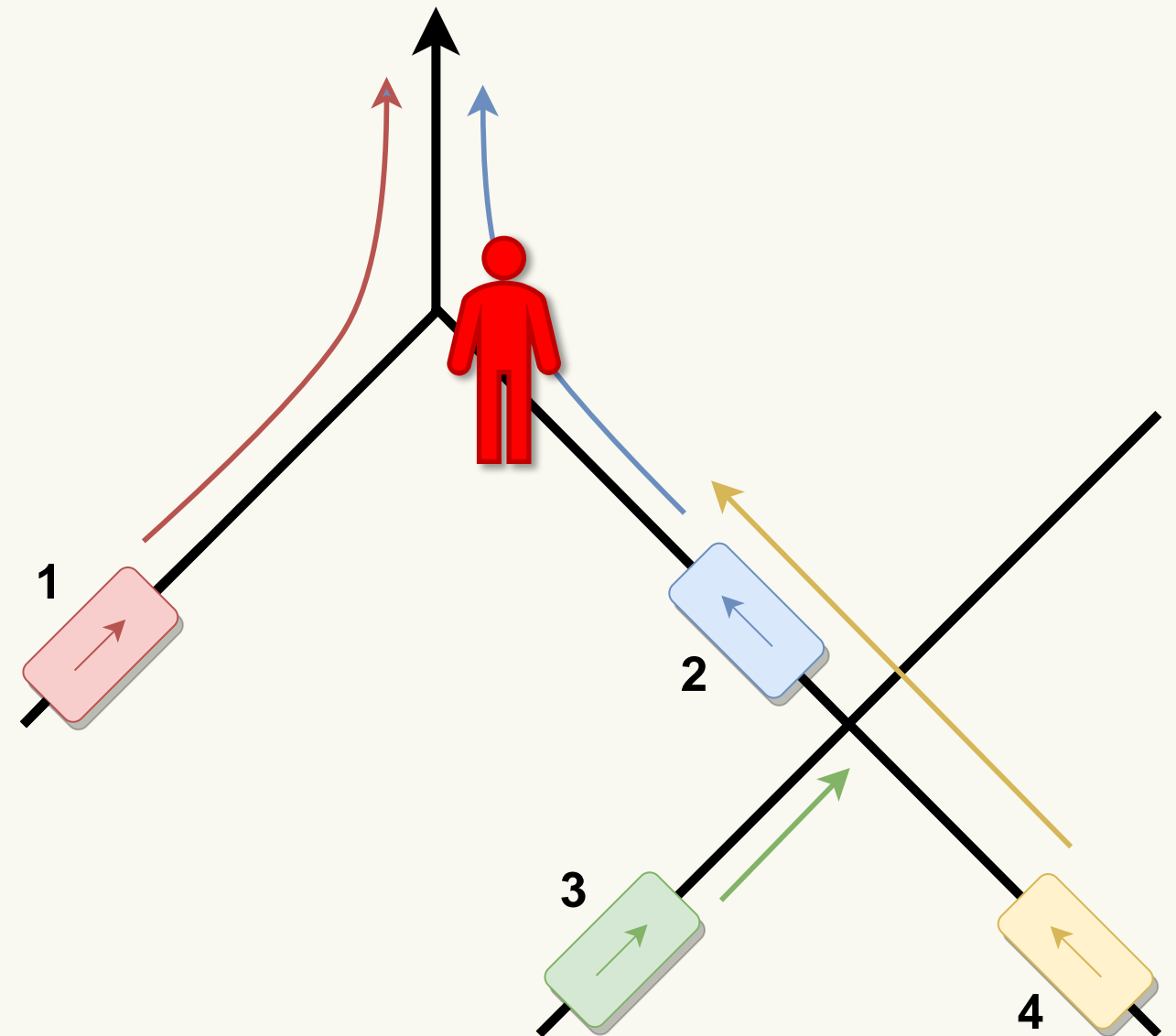
Merging Traffic

- Order of scheduling is important
 - Merging roads
 - Intersections
- Finding competing vehicles is hard
 - Must traverse the road graph backwards, but be careful
- Or schedule anyway and let the next vehicle invalidate it?
- Extra road markup can help



Invalidations

- When a schedule is no longer valid
- Usually triggered by outside interference at a location
 - Player may walk in the road
 - A tree may fall over and block lanes
- Truncate affected schedules
 - Propagates backwards through road graph
 - Can also propagate forwards!
- Expensive, can cause spikes



Outside Interference

- Primary cause of invalidations
- Game entities block the road
 - Wait at temporary blockages
 - Permanent blockages are harder
- Collisions may occur



Wrapping Up


- Vehicle scheduling is just a component of the wider system
- Many features didn't get covered today
 - Road graph construction
 - Pathfinding
 - Pedestrian scheduling
 - ...

Contact Us

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