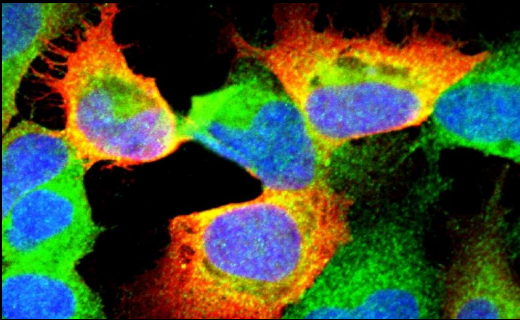




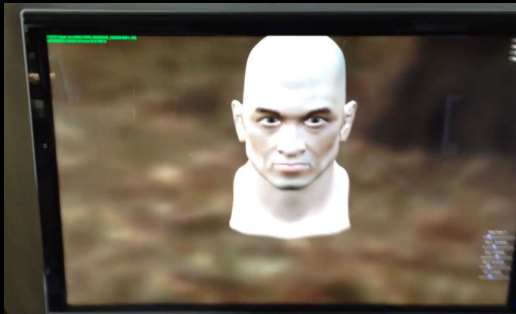
Opportunities in real-time 3D autonomous driving simulations

Jon Hogins, Sr. Software Engineer

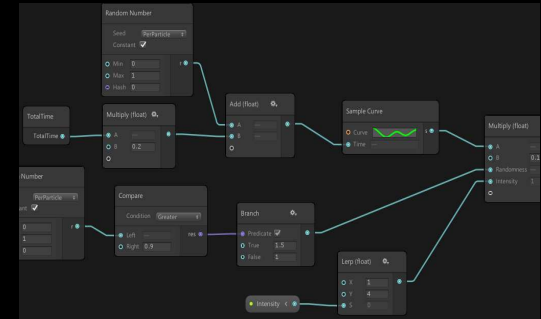
Background



Computer vision algorithms for segmentation, identification, and tracking



Real-time rendering using GPU compute



Programming language & creative tool design

**Game engines will be
critical in solving the AV
problem**

Autonomous Vehicle Perception Problem

- AV perception is driven by **Machine Learning**
- ML development is extremely **data heavy**
- Collecting data for ML is **expensive**
- Annotating data is both **expensive and error prone**
- **Real-world** data can only prepare for what **has already happened**





Explosion of Real-Time 3D

Real-time 3D engines are transforming our world.

- Optimized performance
- Flexible rendering
 - Physically-based rendering
 - Post-processing
 - Real-time ray tracing
- Mature content workflows





Can We Use Synthetic Data?

Research says yes

- Barcelona, Stanford, ... have published papers validating the approach
- Techniques like domain randomization proving useful
- Area of active research – flexibility is key

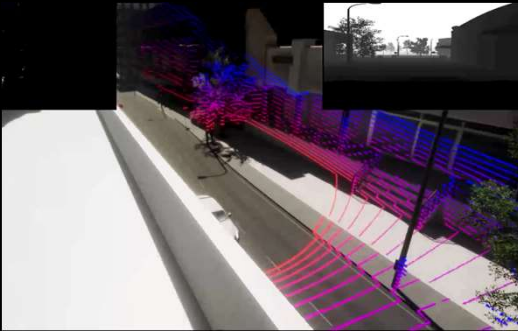
Unity as a Simulation Platform for Autonomous Vehicles

Unity is Growing as a Simulation Platform

- Rendering Pipeline Options for Realism and Performance
- Other Enhanced Rendering Capabilities
- New Data-oriented Tech Stack
- Asset Store to Bootstrap Content
- New Editor and Workflow Capabilities
- Pluggable Physics
- TensorFlow Integration for Agent Training (ML Agents)

Rendering Pipeline Options

Render for your specific training application



Scriptable Render Pipeline

Highly customizable rendering technology allows you to tailor rendering to hardware and implement sensor-relevant rendering details with granular control.



Universal Render Pipeline

Most processor efficient rendering option with improvements in effect quality. Useful for lower resolution applications. Easy to customize with C#.



High Definition Render Pipeline

High fidelity visuals for the performance critical applications (reflections, glare). Professional processing tools. Simulate physical cameras precisely.

Extra Rendering Capabilities

Ensure lighting is optimal for simulation realism



Real-time Ray Tracing

Moves graphics significantly closer to realism, opening the doors to global rendering effects once thought impossible in real-time.

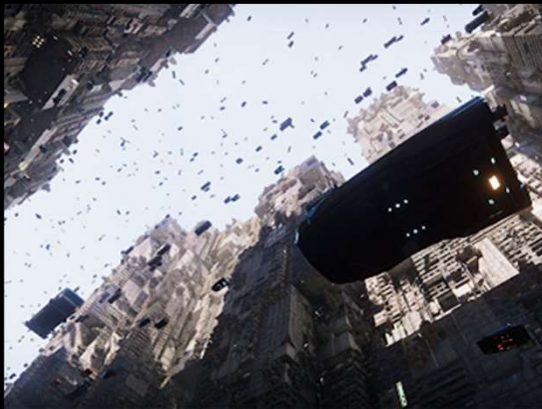


GPU Progressive Light Mapper

Allows incredible iteration speeds for lighting and level design by providing interactive updates and continuous feedback.

Data-oriented Tech Stack (DOTS)

Scale your simulations to match the real world



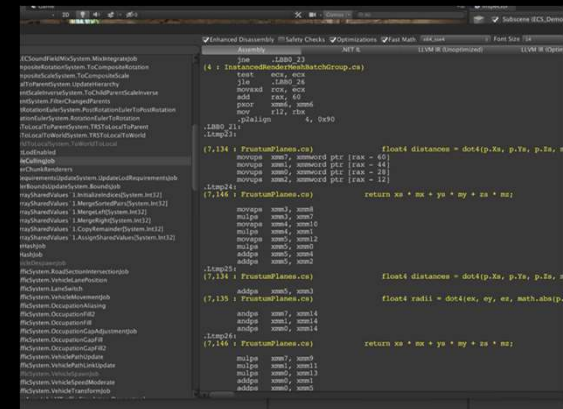
Entity Component System

Framework for organizing data for scalable compute on modern hardware.



C# Job System

Take full advantage of multicore processors without all the programming headache.



Burst Compiler

High performance C# compiler for optimized simulation.

Asset Store

unity Asset Store 3D 2D Add-Ons Audio Templates Tools VFX

Q All Assets Type here to search assets Plus/Pro Learn Game Development Impressive New Assets Shop On Old Store















Home » Unity Technologies » Real World Simulation

UNITY TECHNOLOGIES

Real World Simulation (80)

Assets designed to power real world simulation.

Share

 SAMUEL ABYAN Road Signs Pack ★★★★☆ (4) \$9	 VIE GAMES Highway Construction Set ★★★★☆ (29) \$20
 DEFUSE STUDIOS Realistic Grass Vol. 1 ★★★★☆ (5) \$9.99	 EVLTE Texture Creator ★★★★☆ (7) \$5
 VIE GAMES Landscape Auto Material ★★★★☆ (33) \$99	 TANUKI DIGITAL TENKOKU Dynamic Sky ★★★★★ (171) \$65
 JD CREATIVE MACHINE Civil Construction Pack - Roads, Highways ... ★★★★☆ (5) \$34.95	 MIKAEL GUSTAFSSON Stylized Jungle Pack ★★★★★ (54) \$9.99
 PROCEDURAL WORLDS Gaia ★★★★★ (933) \$67	 REBOUND GAMES Simple Waypoint System ★★★★★ (471) \$15
 RIVERMILL STUDIOS Car Water Spray Trails (not enough ratings) \$15	 RIVERMILL STUDIOS Car Exhaust Effect ★★★★☆ (4) \$5
 MEHDI RABEE Driver (Traffic System) ★★★★☆ (32)	 AGLOBEX Urban Traffic System 2018.2 ★★★★☆ (9)

<https://assetstore.unity.com/lists/real-world-simulation-54066>

EasyRoads3D HD Pack (Andasoft)



Enviro - Sky and Weather (Hendrik Haupt)



New Editor and Workflow Capabilities

Create more complete environments more quickly



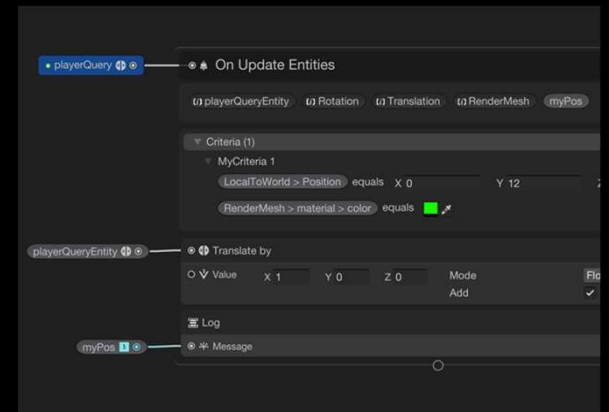
Timeline

Orchestrate scenes and choreograph sequenced events. Fully extensible and automatable.



Environment 2.0

Scalable terrain authoring using a node-based approach to design procedural rules.



DOTS Visual Scripting

Bridge the gap between content creators and engineers through visual programming.

Pluggable Physics

DOTS Physics

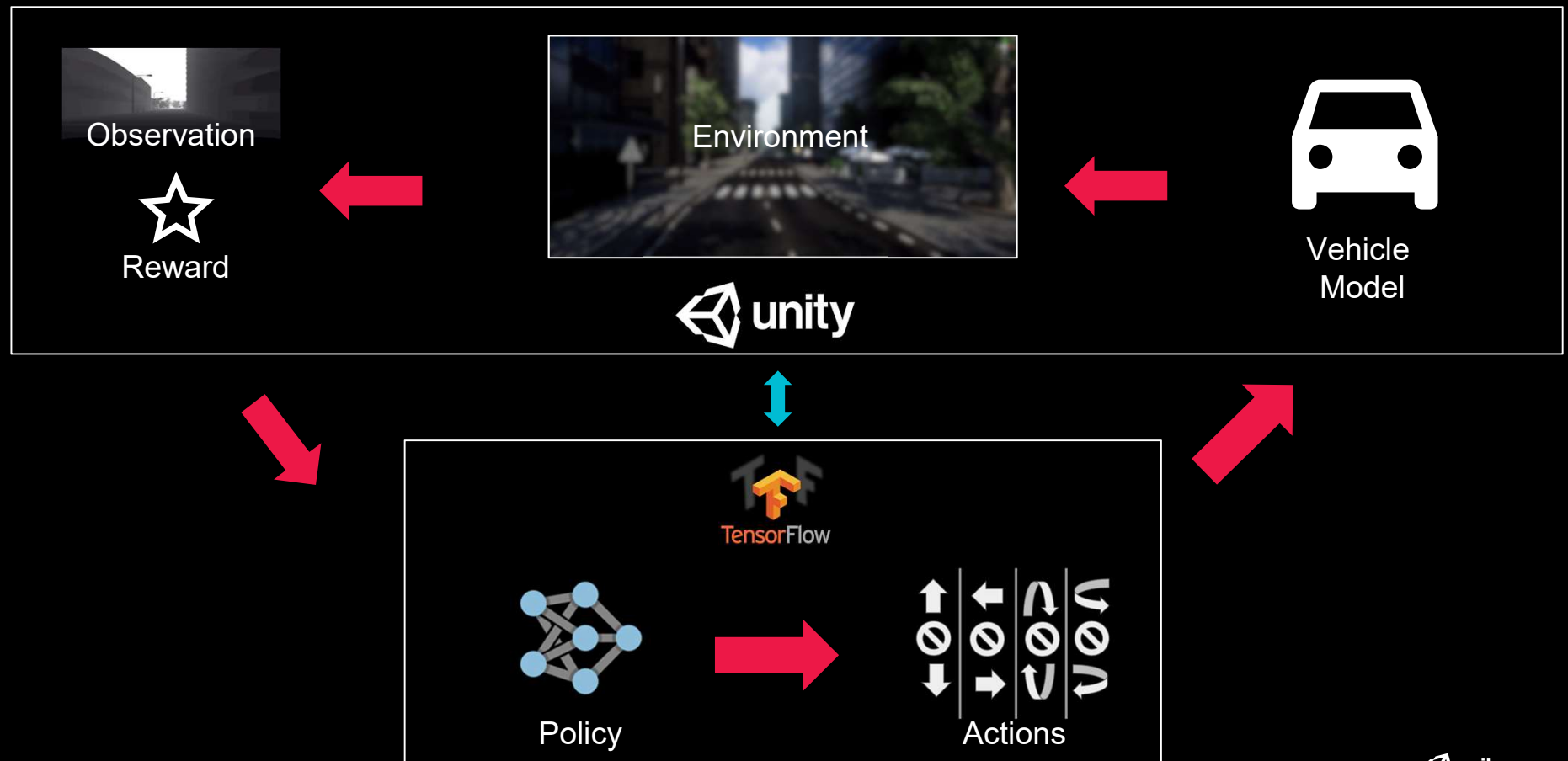
Next generation Unity physics with customizable C# package. Scales to many cores



Havoc Physics

Powered by the industry leading Havok physics engine. Higher performance with lots of dynamic rigid bodies due to caching.

Connect to TensorFlow for Agent Training



A Vision for AV Simulation

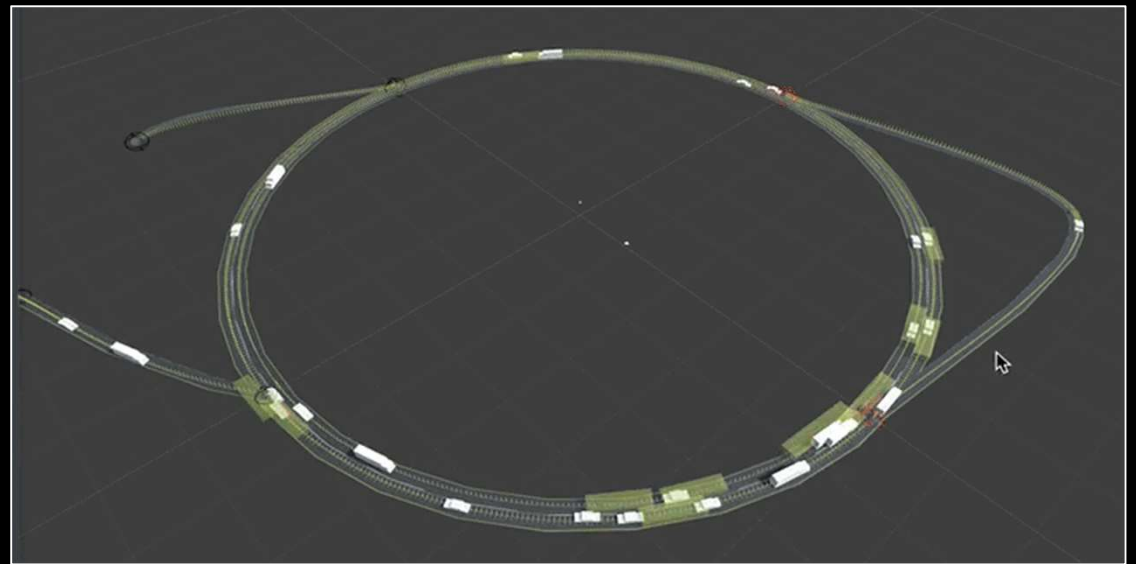


The Autonomous Vehicle Industry Has Proactively Adopted Unity

Camera Customizations for Perception

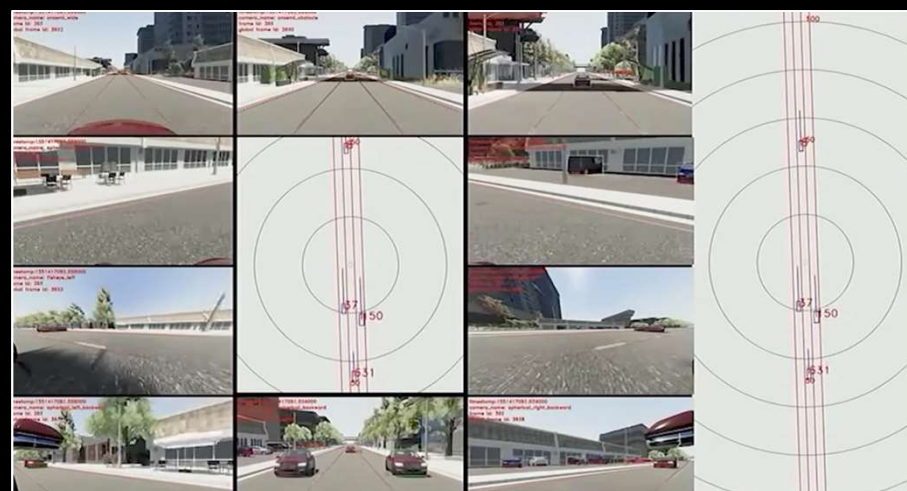
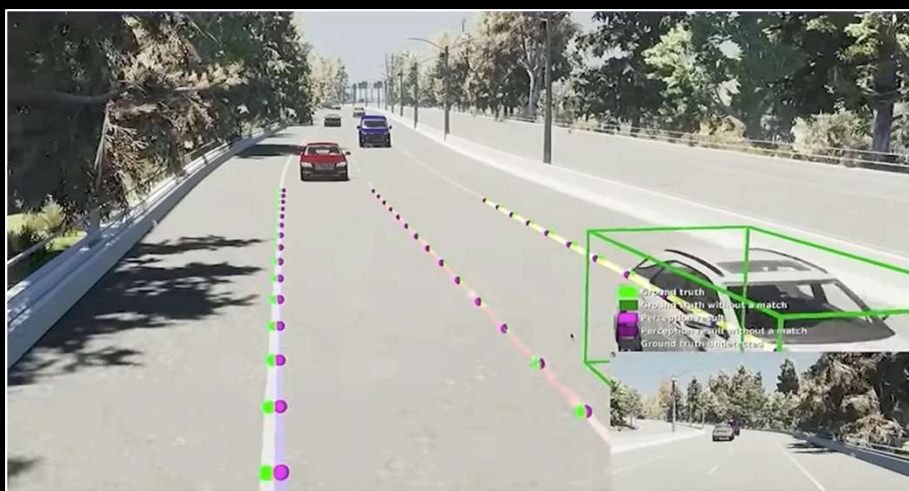


Non-visual Planning Simulators

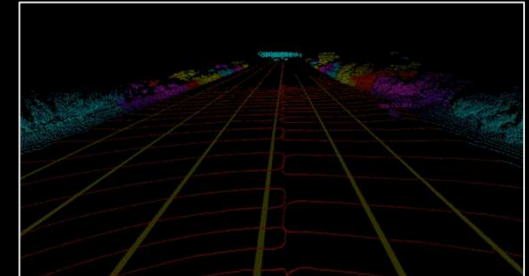


THRE'E

Showcase: Baidu's Apollo



A Snapshot of Our Ecosystem



LUMINAR



TOYOTA
RESEARCH INSTITUTE



cognata

THRE'E

VRDL



CVEDIA

VECTORZERO



UDACITY



Microsoft

itk
ENGINEERING

VRDL

ECHODYNE



mapbox



newSpace
RESEARCH & TECHNOLOGIES

UAB
Universitat Autònoma de Barcelona

CVC^R
Centre de Visió per Computador



INDAGO

Three Reusable Sample Environments



Artificial Scenes included:

- Urban
- Suburban
- Highway



Some Demo Implementations of Sensors

SynCity Lite

Sensor Models
included:

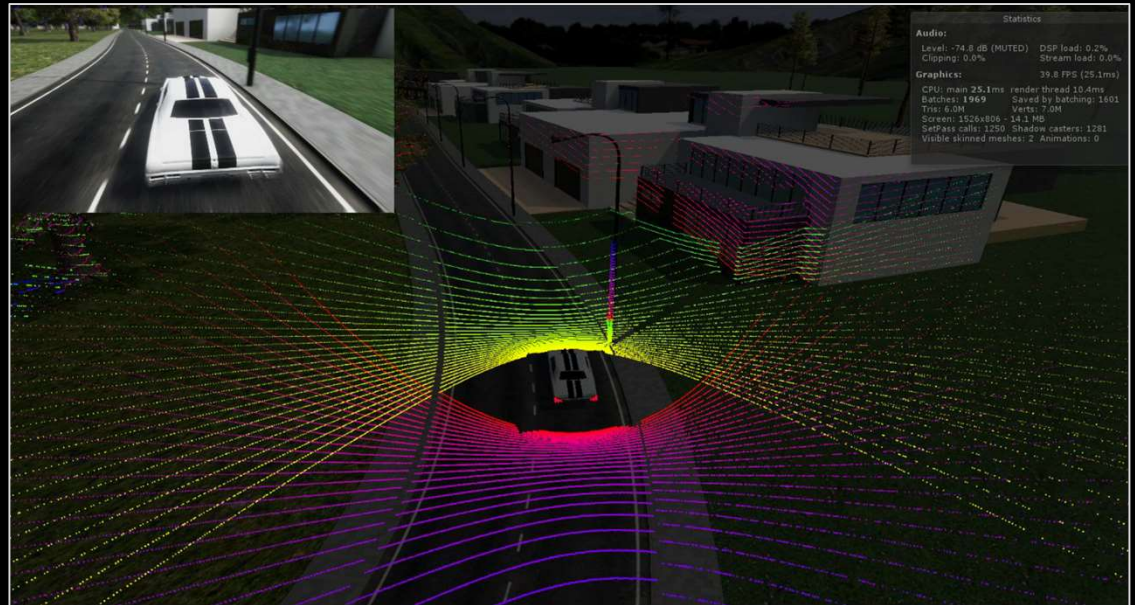
RGB-D Camera

LiDAR

Radar

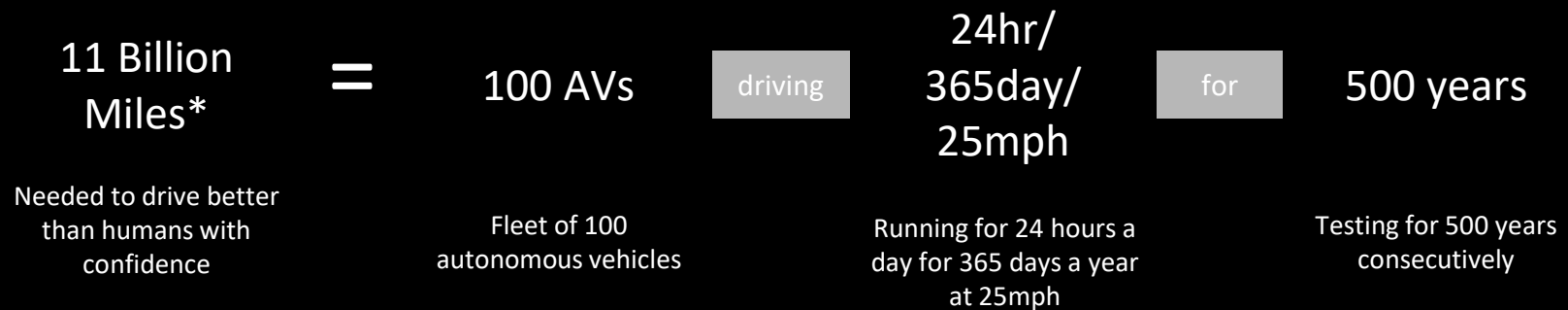
IMU

GPS



Trends and Challenges Ahead of Us

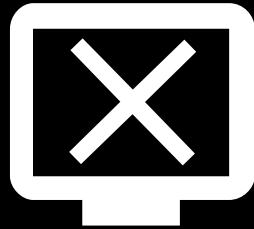
We still need to scale data *massively*.



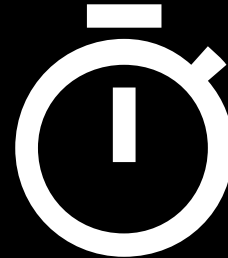
* Estimation by RAND Corporation in 'Driving to Safety: How Many Miles of Driving Would It Take to Demonstrate Autonomous Vehicle Reliability?' (2016)



Unity is positioned to scale on the Cloud



**Headless
Execution**



**Optimized
Runtime**

Research Trend Towards E2E Learning

End-to-End Learning of Driving Models from Large-Scale Video Datasets

Huazhe Xu, Yang Gao, +1 author Trevor Darrell •

Published in IEEE Conference on Computer Vision and Pattern... 2016 • DOI: [10.1109/CVPR.2017.376](https://doi.org/10.1109/CVPR.2017.376)

End-to-end Multi-Modal Multi-Task Vehicle Control for Self-Driving Cars with Visual Perceptions

Zhengyuan Yang, Yixuan Zhang, +2 authors Jiebo Luo •

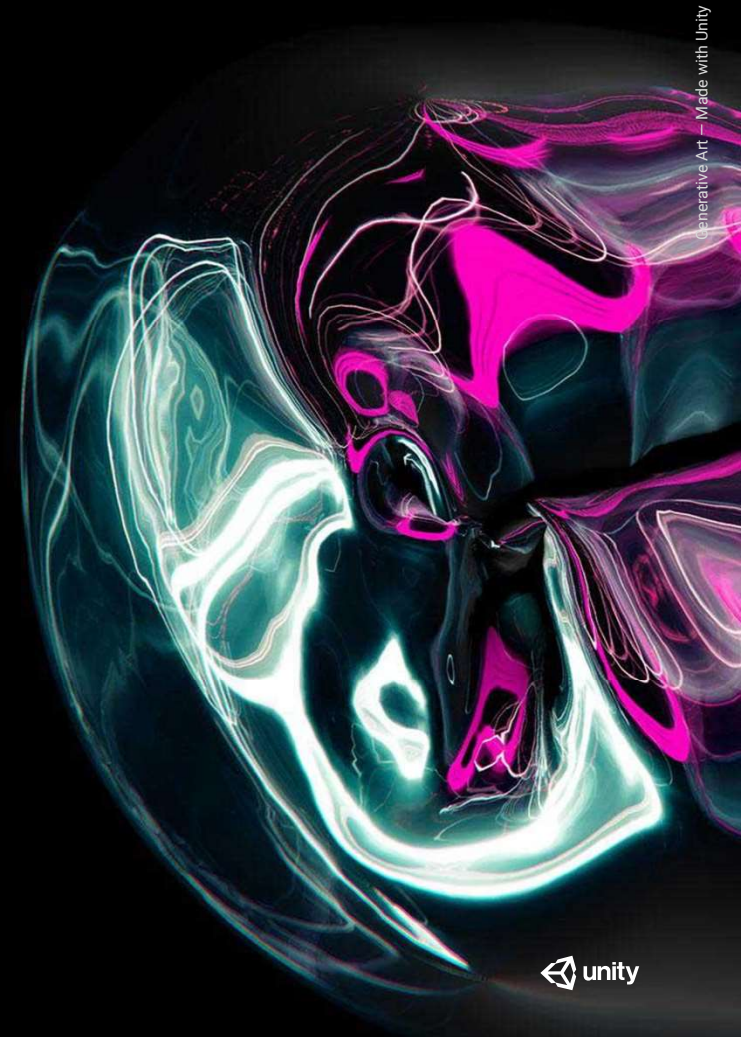
Published in 24th International Conference on Pattern... 2018 • DOI: [10.1109/icpr.2018.8546189](https://doi.org/10.1109/icpr.2018.8546189)

Great Need, Few Established Practices

- Industry knows that physical testing does not scale
- Who will implement the sensor models?
- Who will create the environments?
- Unity will walk this road with you
 - ASAM Member
 - Applied research
 - Support, services, and partnerships

Thank you.

#unity3d



Generative Art — Made with Unity

