

# Simulation The New Reality for AI

**Danny Lange**  
*VP of AI*  
*Unity Technologies*

# About Unity Technologies

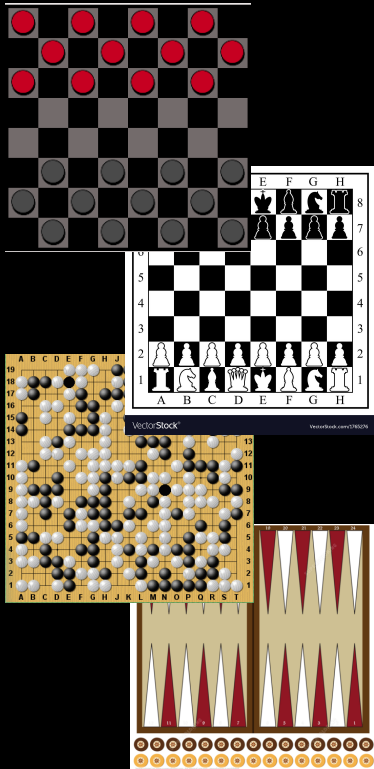
- Real-time 3D Platform
- Games, AR/VR, film, automotive, robotics
- 60% of top 1,000 games made with Unity
- Installed on over 4 billion unique devices
- 2 billion monthly active players
- 3,000 employees with HQ in San Francisco



***Games have been used to  
drive AI research for a  
long time***



# Board and Trivia Games in AI



- 1950: Claude Shannon publishes “Programming a Computer for Playing Chess”
- 1989: Chinook, a Checkers program reaching expert-level abilities, is developed at the University of Alberta
- 1997: IBM Deep Blue defeats champion Garry Kasparov in Chess
- 2011: IBM Watson defeated Ken Jennings and Brad Rutter in Jeopardy! using NLP, info retrieval and automated reasoning
- 2016: DeepMind’s AlphaGo defeats champion Lee Sedol in Go

# Board and Trivia Games in AI



- Atari 2600 Games - DeepMind, OpenAI
- Doom - VizDoom from Poznan University
- Quake 3 - DeepMind
- Minecraft - Microsoft Project Malmo
- Starcraft 2 - DeepMind / Blizzard
- Dota 2 - Open AI Five

# Demis Hassabis - CEO of DeepMind

*“As a former video game designer myself, I couldn’t be more excited to be collaborating with Unity, creating virtual environments for developing and testing the kind of smart, flexible algorithms we need to tackle real-world problems.”*



***So what is it with video  
games that link them to  
AI?***

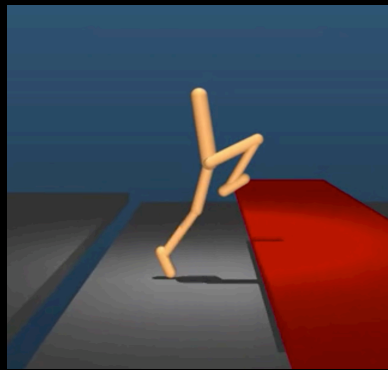


# The Four Dimensions to AI

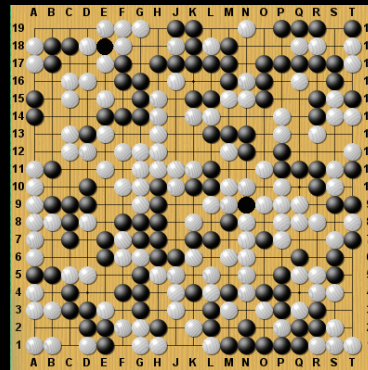
Visual



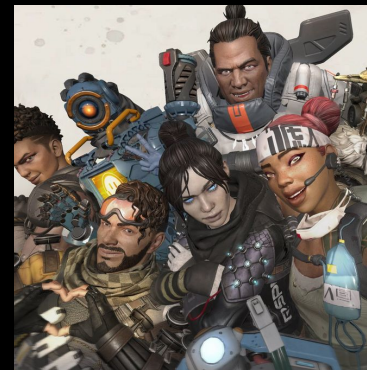
Physical



Cognitive



Social

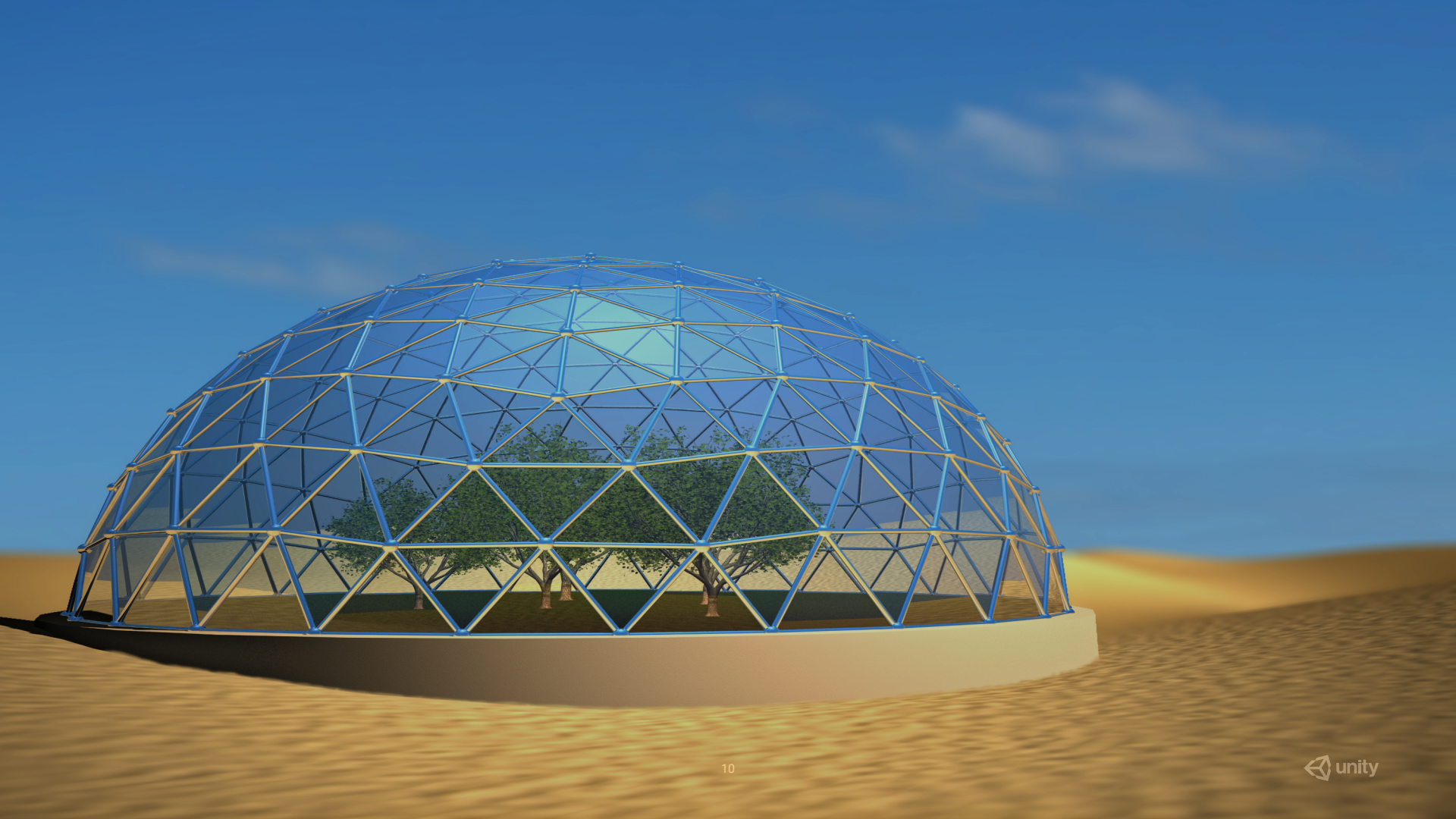




# Real-time 3D Engine

- Spatial environment
- Graphical rendering system
- Multi-sensory
- Physics engine

*Controlled, self-sufficient ecosystem  
that replicates the real world*



# Unity Simulation

*Your Private AI Biodome*



***Let's talk simulation***

***...for training  
Autonomous Systems***



# Sense, Understand, and Interact

## Perception

- Sensors: RGB, Lidar, Radar...
- Supervised Learning
- Object Labelling
- Semantic Segmentation
- Domain Randomization

## Behavior

- Observation | Action | Reward
- Unsupervised Learning
- Reinforcement Learning
- Imitation Learning

# *Perception*



Generative Art — Made with Unity











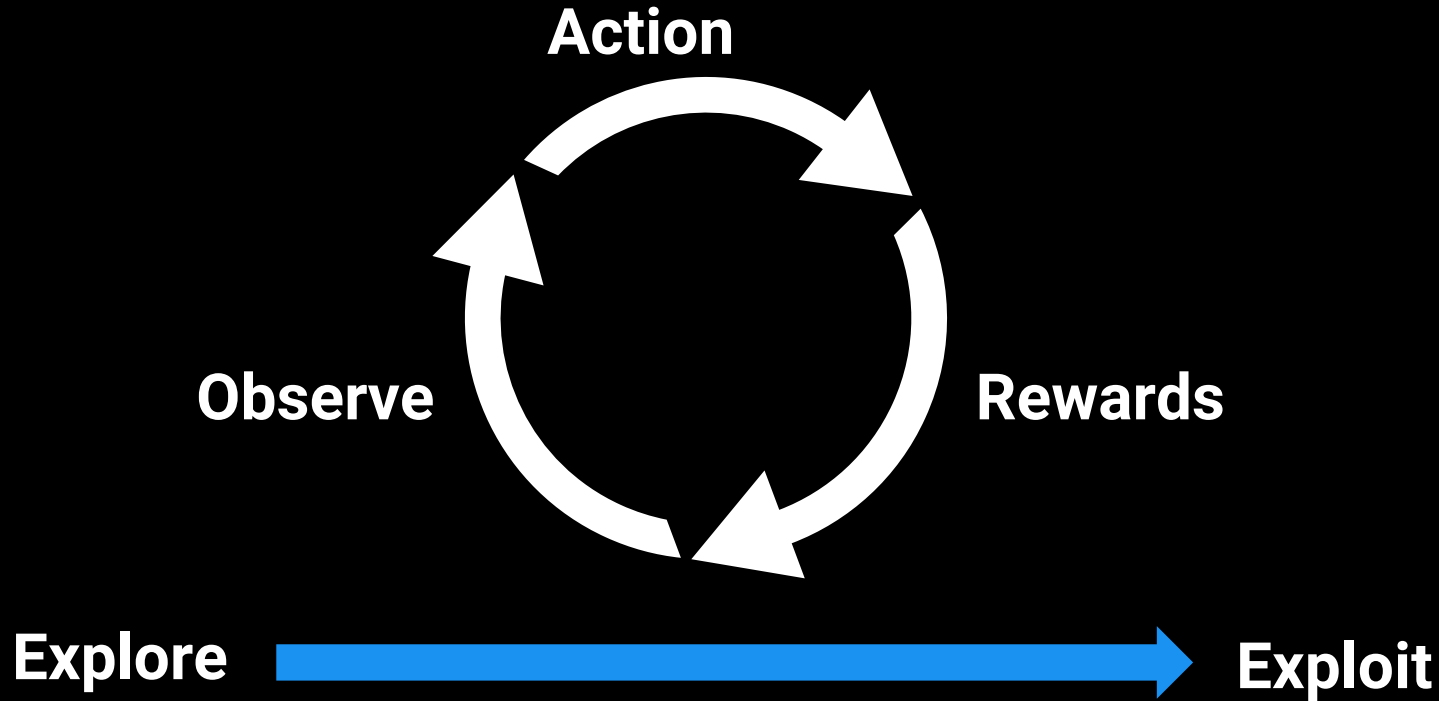
# *Behavior*



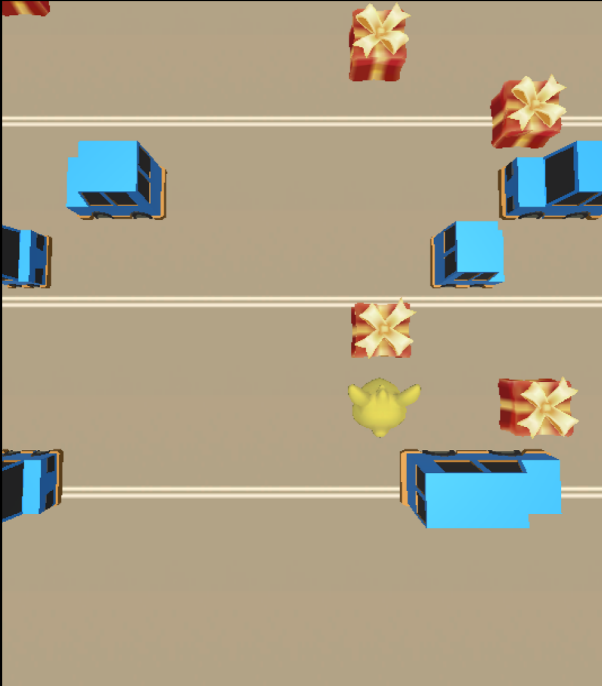
Generative Art — Made with Unity




# Nature's Learning Method: Reinforcement



# Chicken Crossing the Road: Tabula Rasa



- Observe: Pixels in frame
- Actions: 
- Rewards signal
  - Negative for being hit
  - Positive for gift pickup



Source: Peter Pastor



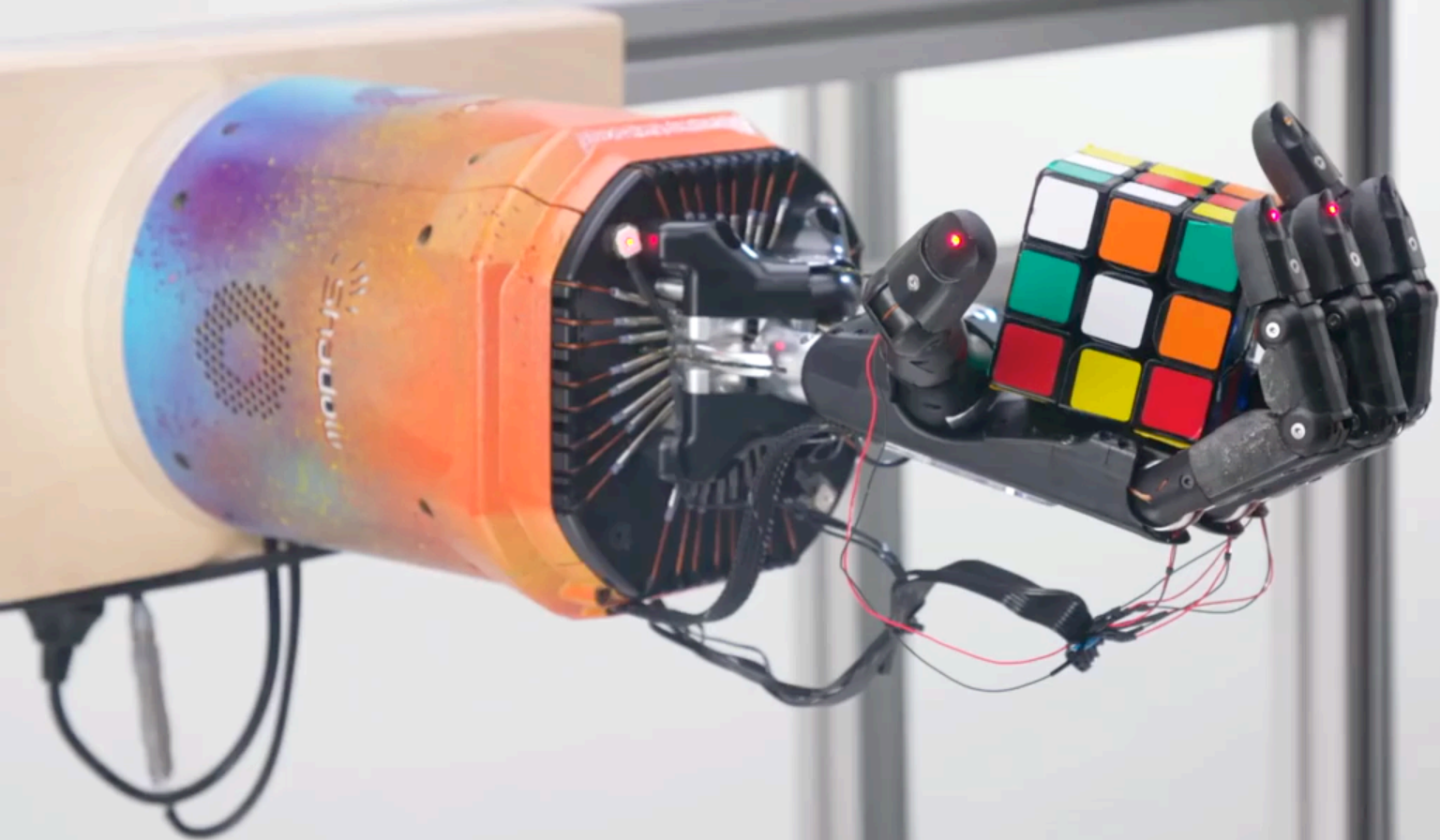


# Synthetic Data: A Look at the Numbers

- 30 Frames per Second (FPS)
- ImageNet (20 Million) in seven days
- One year of your life in 1 Billion frames
- Autonomous systems often operate at 10Hz
- Planck Time:  $5.39 \times 10^{-44}$  sec



# 10 Trillion Simulated Frames



# *Let's talk scale*



Generative Art — Made with Unity

# Beating Evolution

- Accelerated time: Increased framerate
- Massive parallelism: Large-scale deployment
- Single “brain”: Blending species and individual
- Stepping back in time: Checkpointing
- Lower frequency: Drop the fill frames

# Publications

Cognitive Robotics: Making Robots Sense, Understand, and Interact  
Danny Lange. *Computer* 52(12):39-44, December 2019

Unity: A General Platform for Intelligent Agents  
Arthur Juliani et al. <https://arxiv.org/abs/1809.02627>

Obstacle Tower: A Generalization Challenge in Vision, Control, and  
Planning  
Arthur Juliani et al. <https://arxiv.org/abs/1902.0137>

# Where to Learn More

ML-Agents

*<https://www.github.com/Unity-Technologies/ml-agents>*

Unity Simulation

*<https://unity.com/products/simulation>*

# Thank You

@danny\_lange 

dannylange 

[www.unity.com](http://www.unity.com)