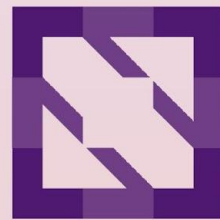




**KubeCon**



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**North America 2023**



# Achieving Real-Time Generative AI During Gameplay for Games Running on Kubernetes

November 9, 2023

**Ishan Sharma**

Sr. Product Manager,  
Google Kubernetes Engine (GKE)  
Google Cloud for Games

**Google** Cloud



KubeCon



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North America 2023



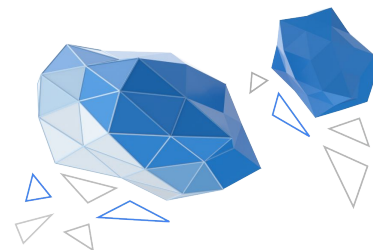


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**01** Generative AI - a brief discussion

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**02** Games - a brief overview

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**03** Generative AI in Games using Kubernetes

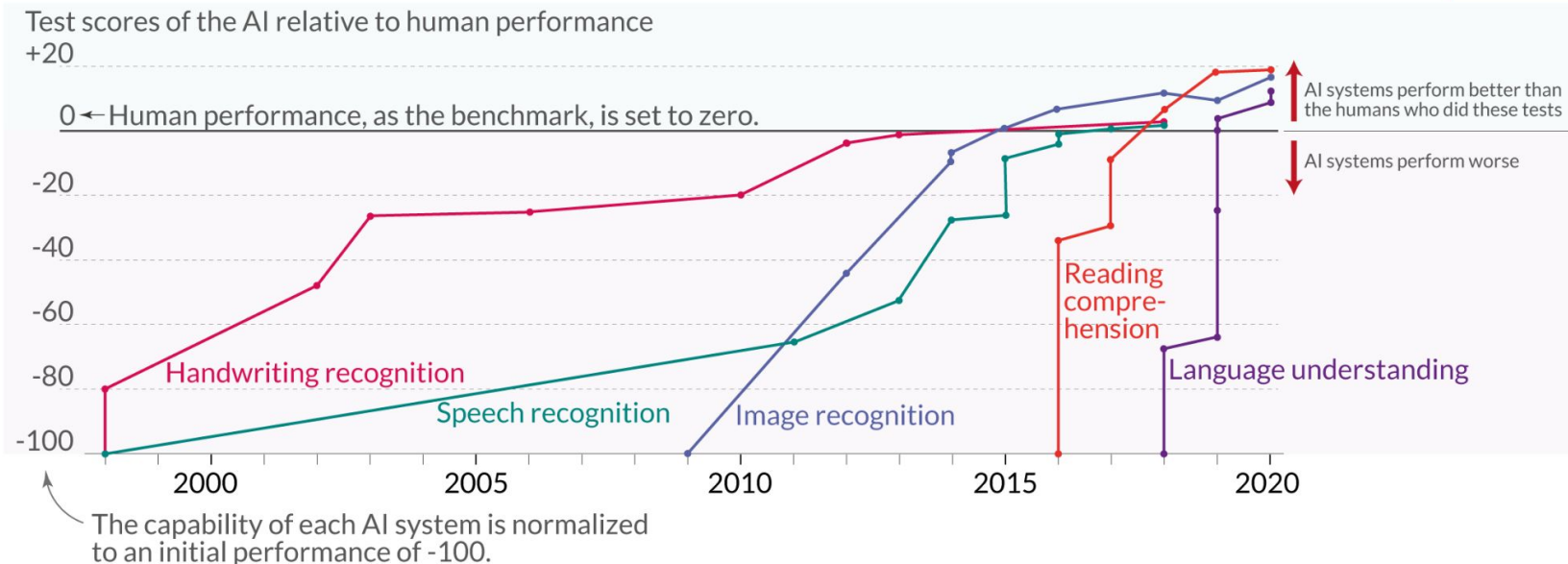
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**04** Demo

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## Language and image recognition capabilities of AI systems have improved rapidly

Our World in Data



Data source: Kiela et al. (2021) – Dynabench: Rethinking Benchmarking in NLP  
OurWorldinData.org – Research and data to make progress against the world's largest problems.

Licensed under CC-BY by the author Max Roser

# Timeline of images generated by artificial intelligence

These people don't exist. All images were generated by artificial intelligence.



2014



Goodfellow et al. (2014) - Generative Adversarial Networks

2015



Radford, Metz, and Chintala (2015) - Unsupervised Representation Learning with Deep Convolutional GANs

2016



Liu and Tuzel (2016) - Coupled GANs

2017



Karras et al. (2017) - Progressive Growing of GANs for Improved Quality, Stability, and Variation

2018



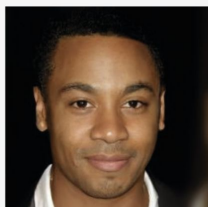
Karras, Laine, and Aila (2018) - A Style-Based Generator Architecture for Generative Adversarial Networks

2019



Karras et al. (2019) - Analyzing and Improving the Image Quality of StyleGAN

2020



Ho, Jain, & Abbeel (2020) - Denoising Diffusion Probabilistic Models

2021

Image generated with the prompt: "a couple of people are sitting on a wood bench"



Ramesh et al. (2021) - Zero-Shot Text-to-Image Generation (OpenAI's DALL-E 1)

2022

Image generated with the prompt: "A Pomeranian is sitting on the King's throne wearing a crown. Two tiger soldiers are standing next to the throne."



Saharia et al. (2022) - Photorealistic Text-to-Image Diffusion Models with Deep Language Understanding (Google's Imagen)

Nov 2023

Image that I generated using Stable Diffusion with the prompt:

*"A photo of Albert Einstein in a space suit watching a solar eclipse."*

<https://stablediffusionweb.com/>





## The future of GenAI is even more **incredible**



Prompt: **A teddy bear running in New York City.**

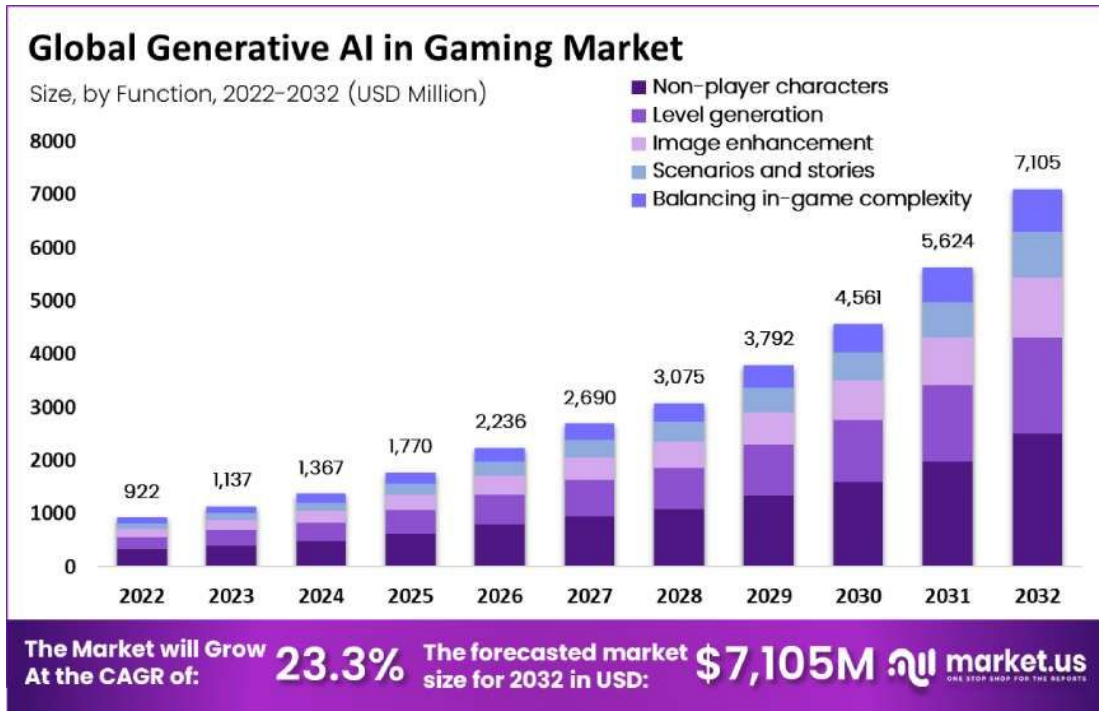
This is an example from [imagen.research.google/video](https://imagen.research.google/video)



Prompt: **A glass bead falling into water with a huge splash. Sunset in the background.**

This is an example from [imagen.research.google/video](https://imagen.research.google/video)

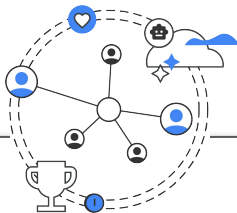
# Generative AI will Transform Live Service Games into **Living Games**



GenAI is being used in **game development** use-cases first, and ultimately will be eclipsed by **new game experiences**



# Classifications of GenAI use cases in Games

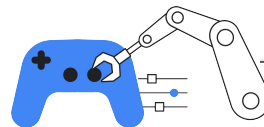


## Improving Productivity during **Game Development**

Use Generative AI to accelerate time-to-launch by creating content and simplifying development

- 2D & 3D assets (characters, props)
- Audio & video assets generation
- Code generation
- AI-based game testing

**Turnkey (VertexAI, Sagemaker) |  
Kubernetes (GKE)**



## Improving Player Experience during **GamePlay**

Use AI/ML & GenAI to adapt the gameplay and empower players to generate game content in realtime.

- Smart NPCs (bots)
- Dynamic in-game content
- Customized player experiences
- User-generated content
- Endless worlds

**Kubernetes (GKE)**

*We will focus on inference during gameplay*

# User pain-points for GenAI in Games

## Platform

### Cost

At-scale cost efficiency to ensure financial feasibility for AAA games

### Latency

Low latency to ensure smooth gameplay & user experience.

### Platform Selection

Platform(s) with performance, & access to models without lock-in.

## AI Maturity

### LLM Unpredictability

Need a coherent, relevant, and contextually appropriate inference

### Avoiding Bias

Training & fine-tuning should not propagate biases & stereotypes

### Content Filtering

Content moderation is needed to ensure safe & inclusive gameplay

## Gameplay

### Creativity vs Boundaries

Need to balance user generated content with game lore & structure

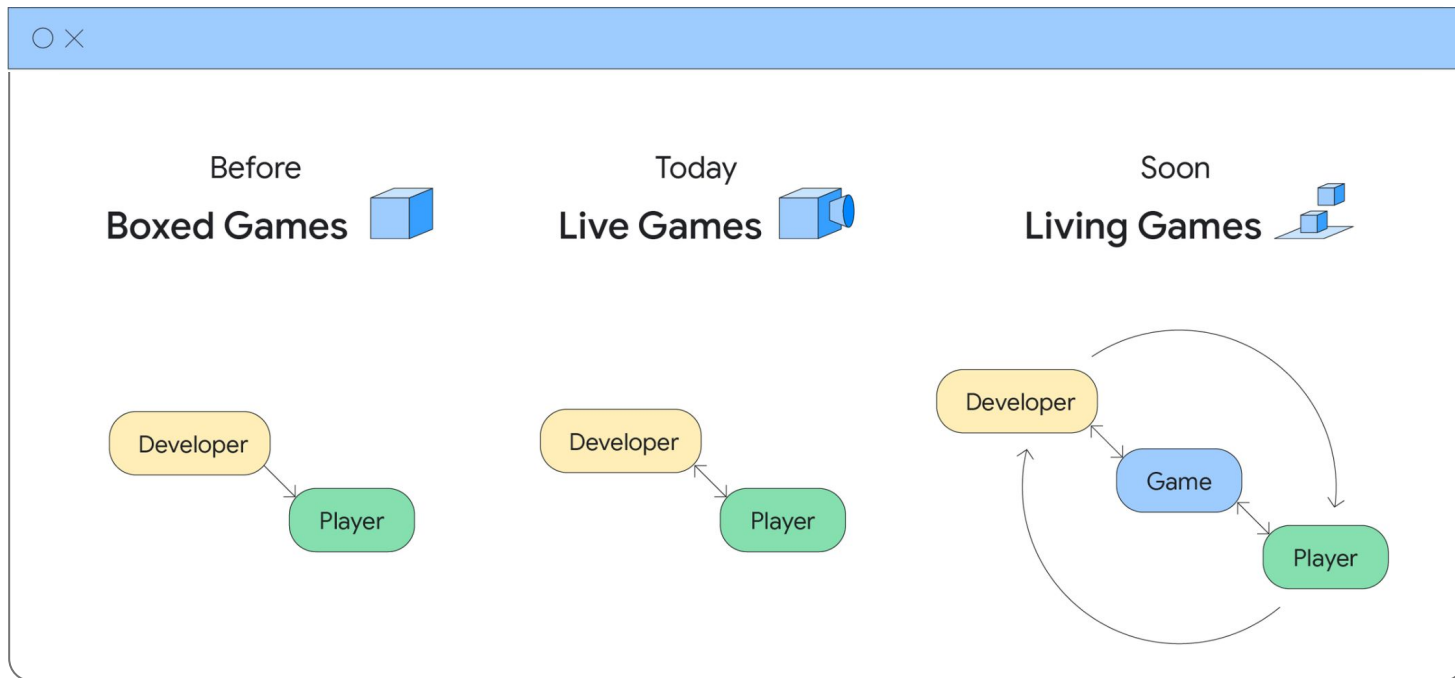
### GenAI model constraints

Some games need content for gameplay which LLMs filter out

### Procedural generation

Procedural generation with GenAI still requires human supervision

# Generative AI is **evolving** the games industry





# Kubernetes is a great computing solution for games

Solves **majority** of the IT operations problems:

- Scheduling, health-checking, deployment methods, autoscaling and rollbacks
- Centralized logging & monitoring
- Extended by a massive ecosystem of tooling
- Declarative paradigm - (say what you want instead of manipulating what you have)
- Primitives for isolation

**Challenge:** Kubernetes on it's own, does not understand how game servers work.

For game servers, we need:

- to maintain **in-memory state**
- to start and shut down game servers **on demand**
- to **protect running servers** from shutting down (even for upgrades!)
- to **scale** based on demand - location, # of players - rather than CPU



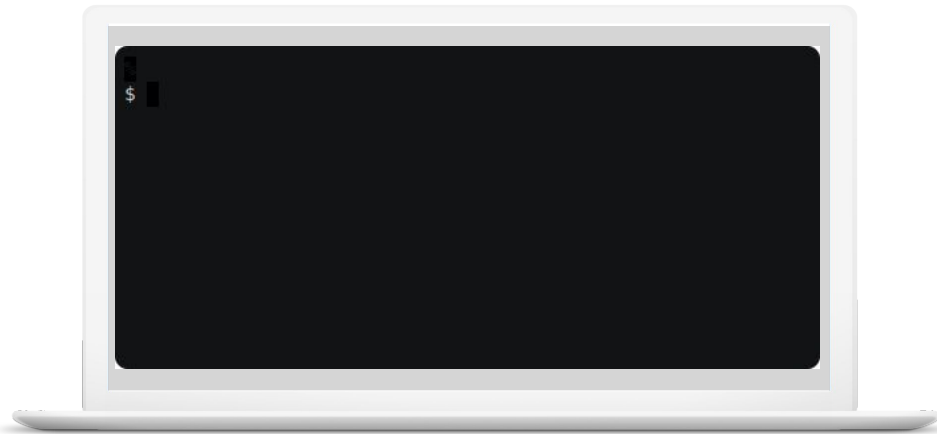
# Agones

Agones enables hosting, running, and scaling dedicated game servers **on Kubernetes**

**Agones** is an open source, batteries-included, multiplayer dedicated game server scaling and orchestration platform that can run anywhere Kubernetes can run.

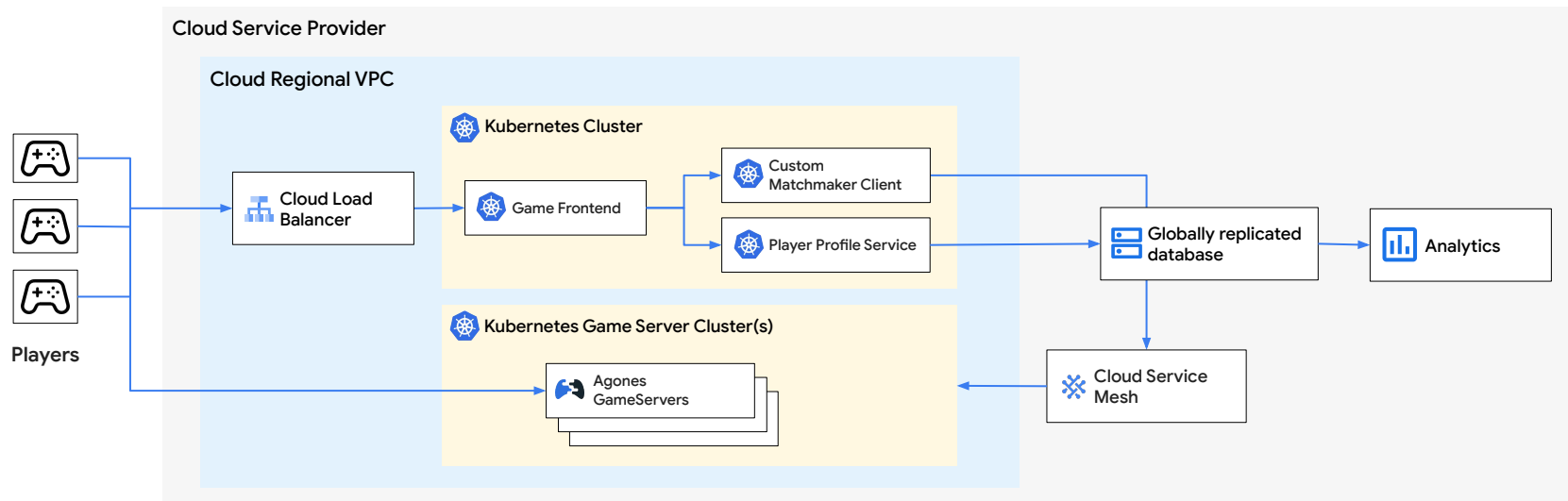
Get all the benefits of the Kubernetes operations, but now for game servers as well:

- **Termination:** understand game matches
- **Scaling:** understand player load
- **Networking:** Multiple UDP/TCP ports per node
- **Hot-spares:** Tunable warm-up parameters
- **Open source:** No vendor lock-in



Learn more at [agones.dev](https://agones.dev)

## High-level architecture of a live service game

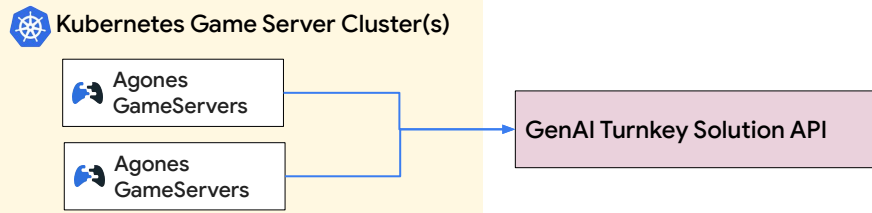


*How do we add GenAI inference to gameplay?*



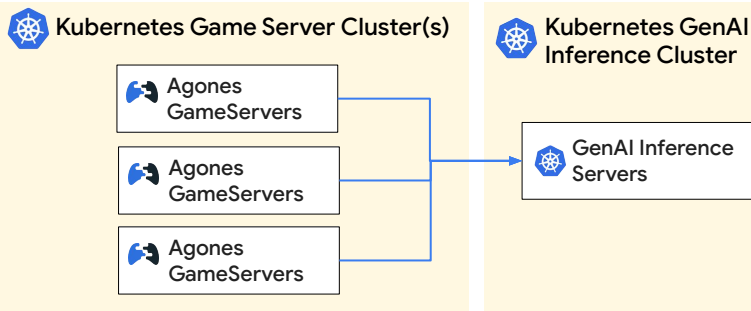
# Integrating GenAI inference with gameservers

**Turnkey Solution**  
(E.g. VertexAI,  
Sagemaker, etc.)

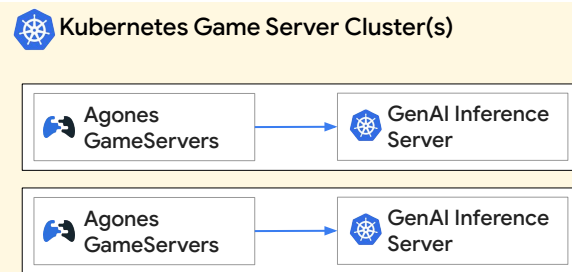


**DIY Solution  
with Kubernetes**

## Dedicated GenAI Inference Kubernetes Nodes



## GenAI inference Sidecar



# Discussion on integrating **GenAI inference** with gameservers

## Advantages of using a Turnkey solution:

- Game development use-cases
- Improving time-to-value: POCs for realtime use-cases during gameplay
- Specific models only available through Turnkey APIs

## DIY solution with Kubernetes for GenAI in games:

- Increasing number of openly available models that can run in containers
- Cost optimization at-scale: k8s can be more cost-effective than pay-per-use APIs for high usage scenarios (game launches)
- Dedicated inference k8s nodes are easy to set up with k8s features such as HPA, scheduling with taints/tolerations, etc.
- GenAI sidecars may have a slight advantage in latency, but are costly (1:1)

GenAI Inference Deployment Method	Latency	
	Image Generation (Stable Diffusion)	Text Generation (Bloom)
Dedicated Inference Kubernetes Nodes	~1s-1.3s	~146-147 ms
Inference Sidecar	~1s-1.3s	~144-145 ms

**Today, inference latency overpowers any difference between different Kubernetes deployment methods. Dedicated inference k8s nodes provide the most versatility, ease of use, and flexibility.**

# Using **Kubernetes** for GenAI in games

## Portability

**Write Once.  
Run Everywhere.**

- Train and serve the same model(s) across clouds and on-premises
- Open standards prevent vendor lock-in



**Kubernetes**

Industry standard compute orchestration platform available anywhere you need it

## Flexibility

**Choose the right framework(s) for the job**

- Meet the needs of multiple teams with their framework of choice
- Customize the platform to meet your structure and requirements



**beam**



**RAPIDS**

**XGBoost**

Vibrant ecosystem of frameworks from which to choose

## Scalability & Performance

**Fine tune performance and scale the platform**

- Hyper-optimize the architecture for peak performance
- Scale the platform to meet the needs of all of your ML workloads

## Cost & Efficiency

**Pay for what you need when you need it**

- Higher utilization of compute resources (CPUs, GPUs, TPUs) and cost savings with Spot
- Reduced operational costs for unified platform



**Run alongside game servers on Kubernetes.**

- Improve latency & performance by running AI inference alongside game servers using Agones on Kubernetes.
- Reduce management overhead by using fully managed K8s (GKE Autopilot) for game servers



KubeCon



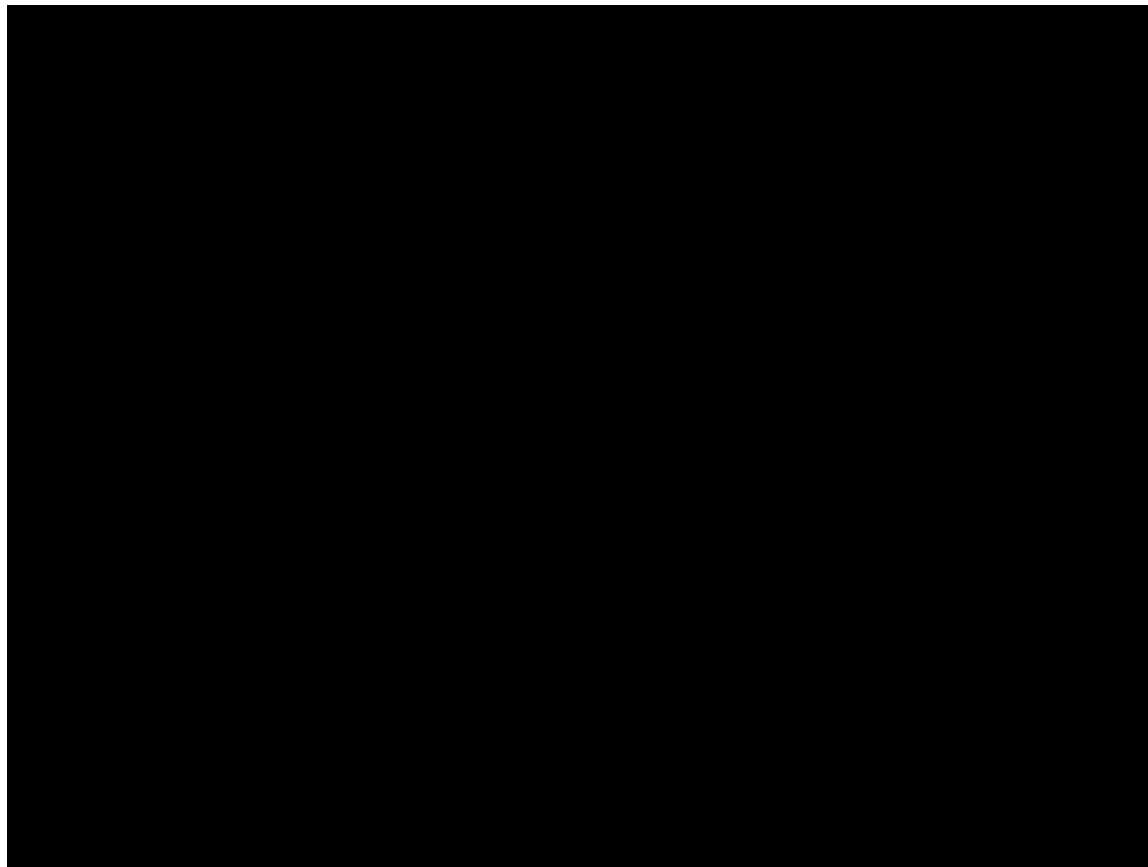
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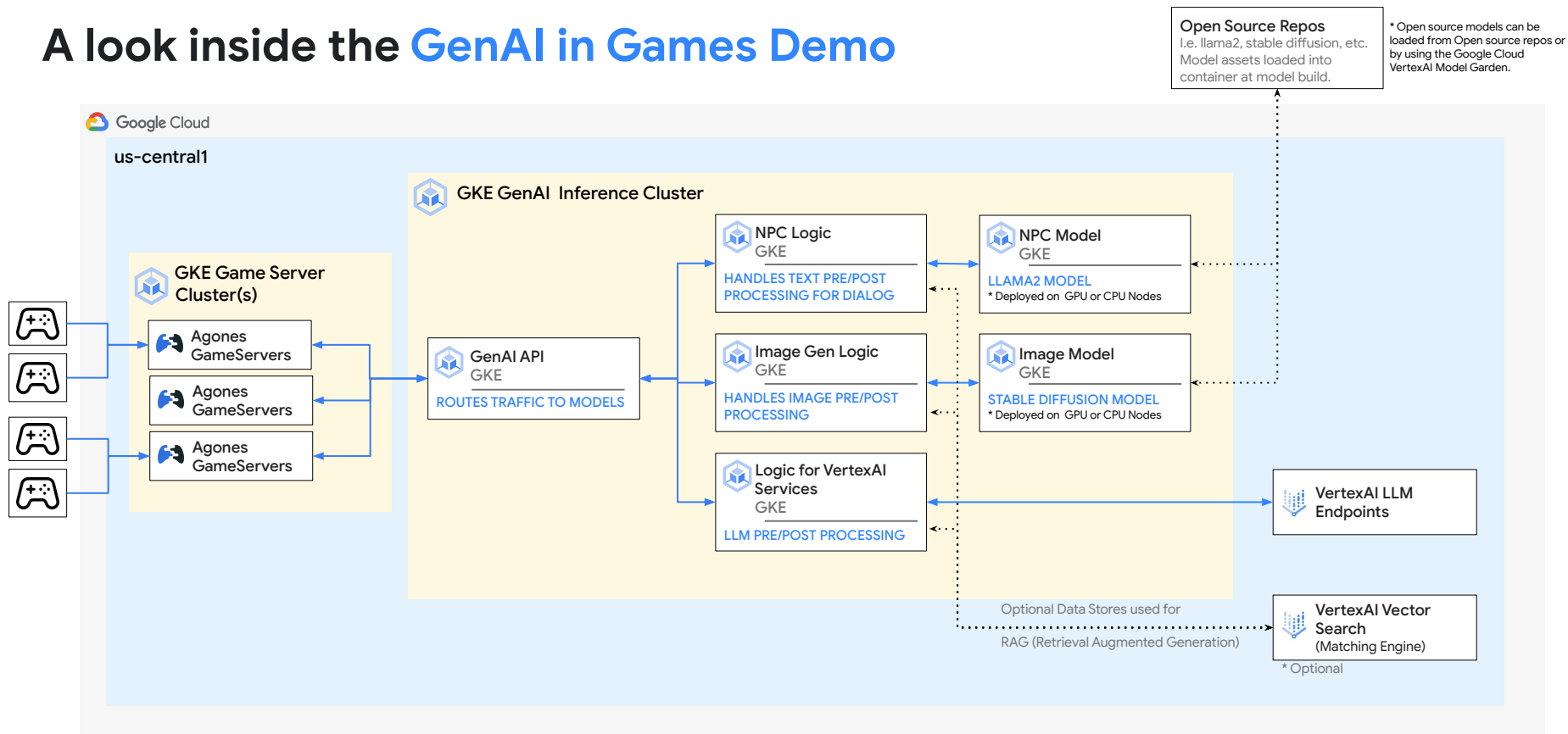
# Demo

Google Cloud





# A look inside the GenAI in Games Demo





## Acknowledgements

Google Kubernetes Engine (GKE) Team	
Technical leadership	Robert Bailey
GKE Games Engineering	Zach Loafman Max Gong Ivy Gooch
GKE AI Inference Team (benchmarking)	Kellen Swain Abdullah Gharaibeh
GKE User Research	Anna Poznyakov
Leadership	Alex Bulankou Iftach Ragoler Maulin Patel Jack Buser

Generative AI in Games Demo	
Google Cloud team	Globant team
Patrick Smith Dan Zaratsian Michael Bychkowski Giovane Moura Jr Sebastian Weigand Mark Mandel	Laura Gonzalez Cristian Giovagnoli Diego Salatino Rafael Martins Arturo Salinas Fede Vezzoso Jesus Gonzalez Matias Rodriguez Maggie Avallone



As you explore integrating Generative AI in your games, consider deploying your services on Kubernetes - matchmaking, game servers, and generative AI inference servers.

We would love to connect with you:

- [g2x@google.com](mailto:g2x@google.com)
- [linkedin.com/in/sharmai](https://www.linkedin.com/in/sharmai)
- [twitter.com/lshanthesharma](https://twitter.com/lshanthesharma)

Key links:

- Google Cloud for Games: [goo.gle/cloudforgames](https://goo.gle/cloudforgames)
- GKE: [cloud.google.com/kubernetes-engine](https://cloud.google.com/kubernetes-engine)
- Agones: [agones.dev](https://agones.dev)



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# Thank you

Google Cloud

