




vLLM vs Ollama

Choosing the Right LLM Inference for Real Systems

-  AI is powerful
-  Systems make it usable
-  Inference is an engineering decision

The Real Question

✗ Wrong Question

“Which LLM tool is better?”

✓ Right Question

“Which inference pattern fits my system?”

- ◆ Local vs Production
- ◆ Single-user vs Multi-tenant
- ◆ Low latency vs High throughput
- ◆ Cost vs Performance

👉 **Inference is infrastructure**





Developer-First Inference

✓ Best for:

- Local development & demos 🧪
- Fast iteration & experimentation ⚡
- Single-user or small teams 👤

🔧 Characteristics:

- Simple CLI & API
- Minimal setup
- Runs locally (CPU/GPU)
- Low operational overhead

💡 Think: **Developer productivity**





Production-Grade Inference

✓ Best for:

- High-throughput systems 🚀
- Multi-tenant workloads 🏢
- GPU-optimized inference 💻
- Platform & API layers 🌐

🔧 Characteristics:

- Efficient batching
- PagedAttention (GPU memory optimization)
- High concurrency
- Designed for scale


💡 Think: **Platform reliability & performance**



Key Engineering Differences

Systems View






Area	Ollama	vLLM
Target	Dev / Local	Production
Concurrency	Low	High
GPU Efficiency	Basic	Advanced
Ops Overhead	Minimal	Higher
Scaling	Manual	Built-in patterns

 Same models. **Different systems.**

How Systems Engineers Should Think

Inference Is a Systems Decision

Ask these questions:

-  How many concurrent users?
-  Latency vs throughput requirements?
-  GPU cost constraints?
-  Multi-tenant isolation?
-  Future scaling needs?

 Models change.

 Architecture stays.

When to Migrate: Ollama → vLLM

The Inflection Point

You should start thinking about **vLLM** when:

Traffic increases

- Multiple users hitting the model concurrently
- API-backed applications, not just local usage

Latency becomes inconsistent

- Queueing delays under load
- GPU memory pressure

When to Migrate: Ollama → vLLM



Costs start to matter

- Inefficient GPU utilization
- Need for batching and memory optimization



Platform responsibility appears

- SLAs, SLOs, uptime guarantees
- Multi-tenant isolation

👉 Ollama = build fast

👉 vLLM = scale responsibly

Docker Deployment Patterns

Container-First Inference

Ollama with Docker

✓ Best for:

- Local dev environments
- Demos & labs
- Internal tools

🔧 Pattern:

- Docker / Docker Compose
- Single container per model
- Simple volume mounts

vLLM with Docker

✓ Best for:

- API services
- GPU-backed containers
- CI/CD-driven deployments

🔧 Pattern:

- GPU-enabled containers
- Explicit resource limits
- Reverse proxy (NGINX / API Gateway)


👉 Docker is the **starting point** for both

Kubernetes Patterns

- **Production AI Systems**
- **vLLM on Kubernetes**

 Designed for:

- Horizontal scaling
- Multi-tenant workloads
- Enterprise environments

 Common components:

- GPU node pools
- HPA / custom autoscaling
- Resource quotas
- Ingress / API Gateway
- Observability (metrics + logs)

Production AI Systems

vLLM on Kubernetes



Benefits:

- Predictable scaling
- Cost control
- Fault isolation



Kubernetes is where **AI becomes a platform**



Final Note for the Deck

“AI maturity is not about models — it’s about systems.”

Build Smart. Scale Intentionally.

- ✓ Use **Ollama** to learn, prototype, and move fast
- ✓ Use **vLLM** when reliability, scale, and efficiency matter
- ✓ Match inference to workload maturity

 AI systems succeed **only when infrastructure is done right**

 What inference patterns are you seeing in real systems?

Questions? Reach out to us

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 Want the Full Walkthrough or Hands On Labs?

This entire project — step-by-step, production-ready, with diagrams, videos and code — is covered inside our **AI Systems Engineering - mentored path**.

More information: <https://remoder.com/%F0%9F%A7%A0-ai-systems-engineer>