MCP: using Java and Quarkus to bridge LLMs with your applications and data

Horacio Gonzalez 2025-01-30







Who are we?





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Summary

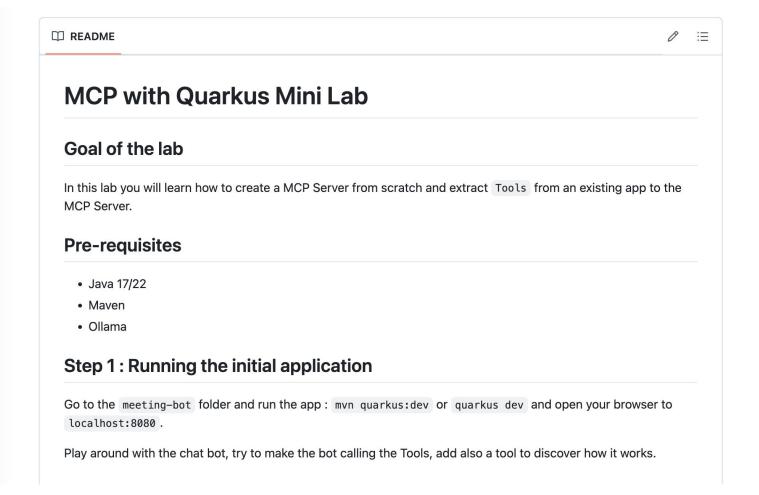


- 1. Introduction
- 2. Understanding LLMs & Their Landscape
- 3. Making Java applications LLM-aware
- 4. Model Context Protocol (MCP): The missing link
- 5. Workshop: Building an MCP server in Java with Quarkus
- 6. The future of Java & LLM integration
- 7. Q&A and discussion





We want to see it working!







https://github.com/sebi-and-horacio/mcp-quarkus-lab



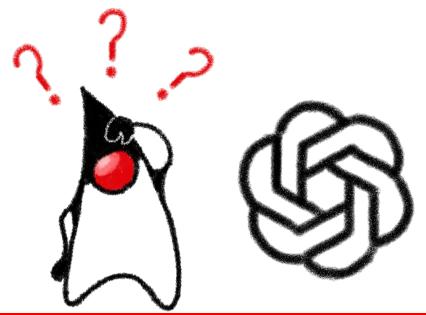






Introduction

LLMs are changing software development how can Java developers take full advantage?



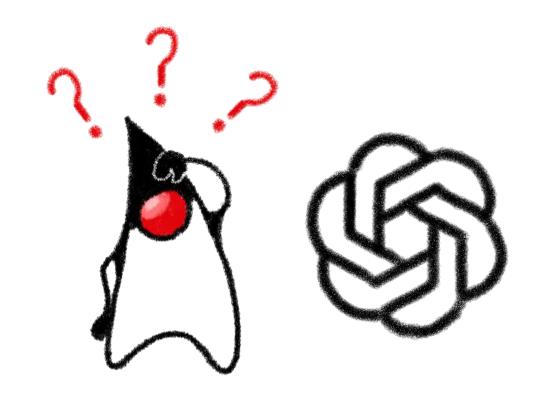






Why are we talking about this?





LLMs are changing development, but most Java apps don't fully leverage them

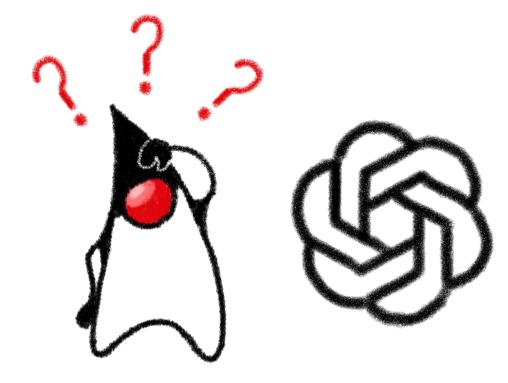




How do you use LLMs for your dev job?



- 1. Who here has already used LLM?
- 2. Who here has already used LLM professionally?
- 3. Who here has already used LLM with code?
- 4. Who here has already used LLMs in a Java app?





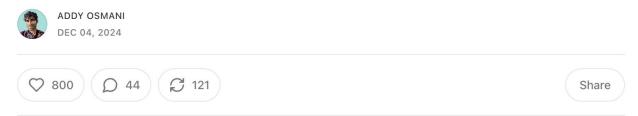


How LLMs are changing dev jobs



The 70% problem: Hard truths about Al-assisted coding

A field guide and why we need to rethink our expectations



After spending the last few years embedded in AI-assisted development, I've noticed a fascinating pattern. While engineers report being dramatically more productive with AI, the actual software we use daily doesn't seem like it's getting noticeably better. What's going on here?

I think I know why, and the answer reveals some fundamental truths about software development that we need to reckon with. Let me share what I've learned.

https://addyo.substack.com/p/the-70-problem-hard-truths-about



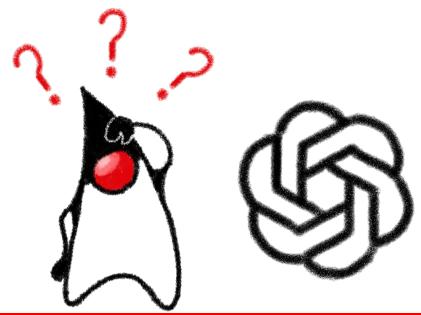








Closed-source, open-source, local choosing the right LLM for your Java application.









LLMs come in different flavors



Not all LLMs are created equal

They have different trade-offs in capabilities, accessibility, and control



Choosing the right one depends on your use case, security needs, and infrastructure.





Closed-source LLMs (Cloud-based APIs)

LUNAPORT

P Examples

OpenAl (ChatGPT), Anthropic (Claude), Google (Gemini), Microsoft (Copilot)

🔽 Advantages:

- Powerful and well-trained (best models available)
- Easy to use via APIs
- Regularly updated & improved

X Challenges:

- Black box (you don't control how they work)
- Expensive (API calls can add up quickly)
- Data privacy concerns (sending requests to external servers)



When to use?

If you need the most advanced models and don't mind API costs or external dependencies.









Open-source LLMs (Self- or cloud-hosted)



📌 Examples

• Meta's Llama 3, Mistral, Google's Gemma, Alibaba's Qwen

00 Llama 3

Advantages:

- Greater control (you know exactly how the model works)
- Can be fine-tuned for specific needs
- No external API costs

MISTRAL AI_

X Challenges:

- Requires more setup (you have to run the model yourself)
- May not be as powerful as the latest closed models
- Needs infrastructure (e.g., GPUs for hosting)



When to use?

• If you need control over the model & lower costs but are okay with slightly weaker performance





Local models (on your machine or server)

LUNASOR

📌 Examples

Ollama, GGUF-based models (e.g., Llama, Mistral, Mixtral)

Advantages:

- Works offline (great for security-sensitive applications)
- No API costs (completely free to use once set up)
- Low latency (responses are instant if hardware is good)

X Challenges:

- Limited by your hardware (needs a strong CPU/GPU)
- Not always as capable as cloud-hosted models
- Setup complexity (installing and optimizing models)

• If you need privacy and control, and you have the hardware to run an LLM efficiently













Choosing the Right Model for your Apps



- Cloud APIs
 - Great for rapid development, but costly and not always secure
- Self-hosted open models
 - Best balance for long-term control and scalability
- Local models
 - Best for privacy-sensitive applications









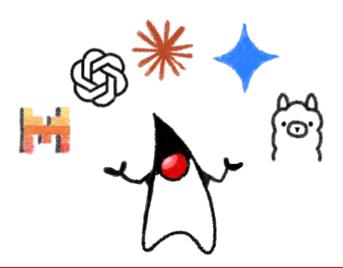






Making Java Applications LLM-Aware

LangChain4j simplifies LLM integration let's see how it works!









Two ways to integrate LLMs with Java



Java applications using LLMs

- Using LLMs as assistants, API consumers, or reasoning engines
- Easier and works well for code generation, chatbots, and Al assistants

2. LLMs using Java applications

- Exposing Java functions, APIs, and databases to LLMs for tool execution
- More powerful but requires tool calling and execution control.





What is LangChain4j?



LangChain4j is a Java library that simplifies LLM integration

It's the Java equivalent of LangChain (Python/JS)

- Prompt management Structured input for LLMs.
- Memory Keeping conversational state.
- Agents Allowing LLMs to decide which tools to use.
- Tool calling Exposing functions to LLMs.



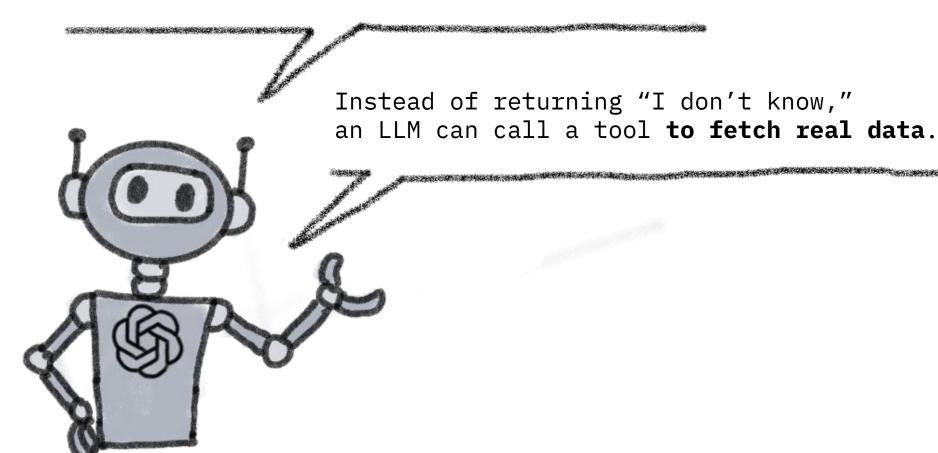




What are tools in LLMs?



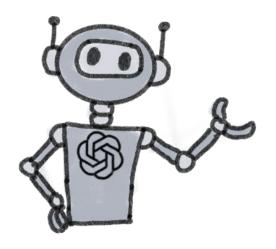
Tools allow LLMs to do more than just generate text. They can interact with APIs, databases, and execute functions.





An LLM without Tools can't answer this





What's the weather like in Sevilla today?

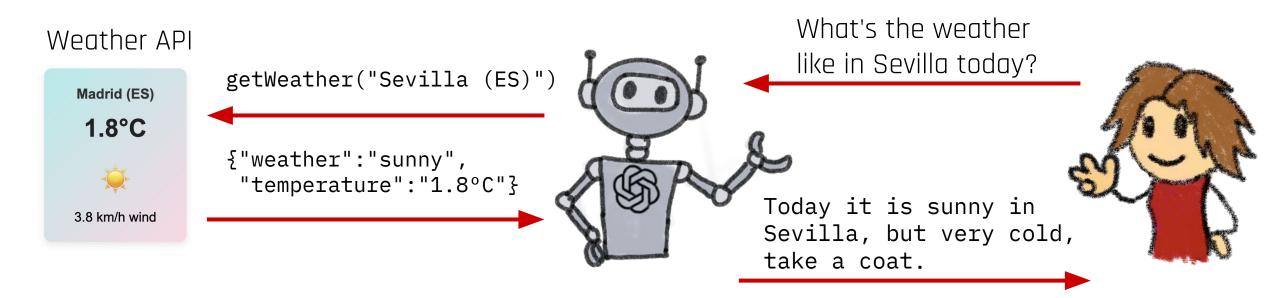
I'm unable to provide real-time information or current weather updates.





Example of how tool calling works





LLM recognizes it needs an external function and calls it. It integrates the result into a natural-language response.



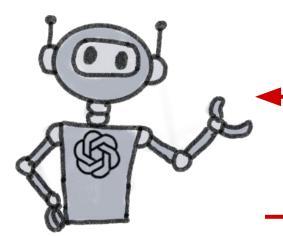




Why this matters?

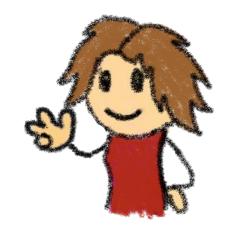


- Moves LLMs from static text generation
 - dynamic system components
- Increases accuracy & real-world usability
- Allows developers to control what the LLM can access



What's the weather like in Madrid today?

Today it is sunny in Madrid, but very cold, take a coat.







Using LangChain4j to Define LLM Tools



```
LyingWeatherTool.java
//DEPS dev.langchain4j:langchain4j:1.0.0-beta1
import dev.langchain4j.agent.tool.Tool;
public class LyingWeatherTool{
 @Tool("A tool to get the current weather in a city")
 public static String getWeather(String city) {
   return "The weather in " + city + " is sunny and hot.";
```

LangChain4j gives as a Tool framework







Using LangChain4j to Define LLM Tools



```
LyingWeatherTool.java
[...]
  Assistant assistant = AiServices.builder(Assistant.class)
      .chatLanguageModel(model).chatMemory(chatMemory)
      .tools(new LyingWeatherTool()).build();
  System. out.println("-----");
  String question = "What will the weather be like in Madrid tomorrow?";
  String response = assistant.chat(question);
  System.out.println(response);
  System. out.println("-----");
\lceil \dots \rceil
```

And an Al Service abstraction











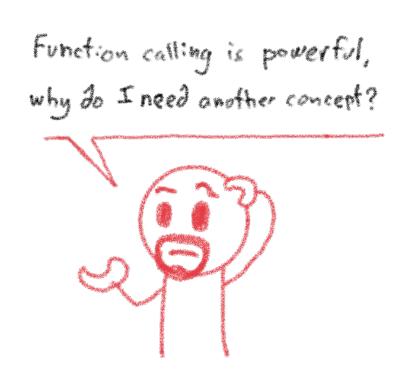
MCP bridges LLMs with your applications, enabling controlled, real-world interactions





Why Do We Need MCP?





LLM function calling is useful, but lacks structure





Why Do We Need MCP?

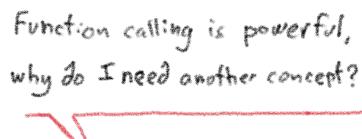


Problem

- LLMs don't automatically know what functions exist.
- No standard way to expose an application's capabilities.
- Hard to control security and execution flow.

Solution: MCP

- MCP defines a standard way to describe and expose functionalities.
- Applications stay in control over what LLMs can do.





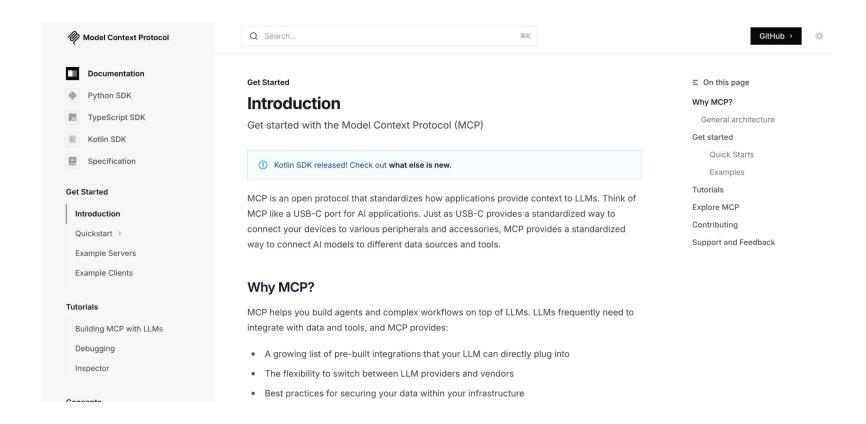






Model Context Protocol





De facto standard for exposing system capabilities to LLMs

https://modelcontextprotocol.io/



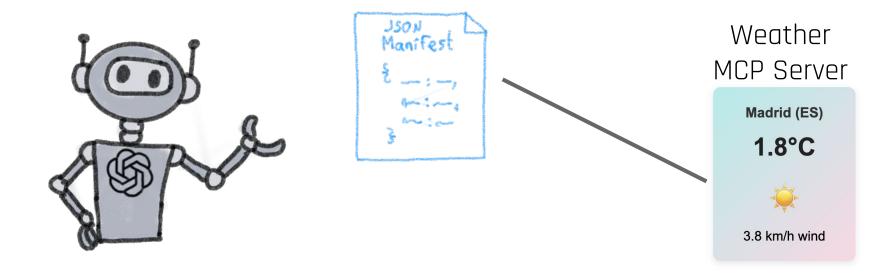




How MCP works



- Applications define an MCP manifest (structured JSON).
- The manifest describes available functions, input/output formats, and security policies.
- LLMs can discover and request function execution safely.





MCP is provider-agnostic



Works with any LLM provider



Ensures standardized function exposure across platforms





Understanding the MCP Manifest



```
mcp-manifest.json
{ "functions": [
      "name": "getWeather",
      "description": "Fetches the current weather for a city.",
       "parameters": {
         "city": { "type": "string", "required": true },
         "countryCode": { "type": "string", "required": true }
 ] }
```

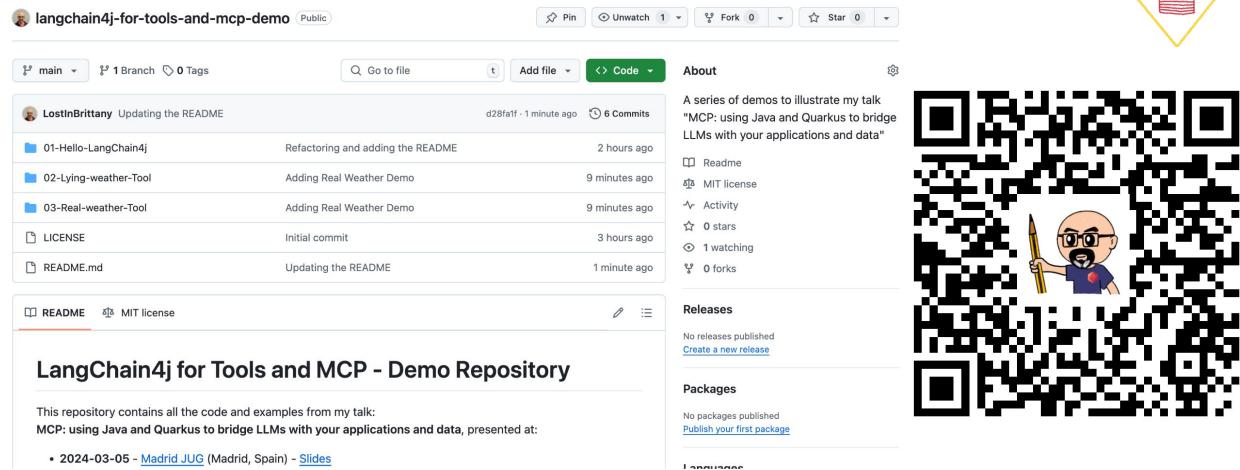
- Lists available tools
- Describes expected inputs/outputs
- Defines execution policies





We want to see it working!





https://github.com/LostInBrittany/langchain4j-for-tools-and-mcp-demo/









That's all, folks!

Thank you all!







