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## 1. Introduction

This document provides over 25 pages of the latest and most challenging interview questions and exercises used in hiring processes for top GenAI roles at companies like X (formerly Twitter), Google DeepMind, Microsoft, OpenAI, Meta, WhatsApp, and Anthropic.

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## 2. Core GenAI Knowledge Questions

**Q1: What is the difference between autoregressive and autoencoding models in NLP?**

**Q2: Compare BERT, GPT-4, Claude, and Gemini models.**

**Q3: Explain the concept of tokenization in large language models. What challenges do different tokenizers present?**

**Q4: How does attention differ from self-attention in Transformer models?**

**Q5: What are common pretraining objectives for GenAI models?**

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### 3. Prompt Engineering Challenges

**Q6:** Design a prompt to extract structured data from an unstructured legal document.

**Q7:** Rewrite this prompt to make it more robust against hallucinations: "Summarize this text in one paragraph."

**Q8:** How would you chain prompts for a multi-step workflow like document summarization and sentiment analysis?

**Q9:** Create an adversarial prompt that breaks the summarization guardrails of a basic LLM.

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### 4. LLM Architecture and Fine-Tuning

**Q10:** Describe the full architecture of a Transformer-based decoder-only model.

**Q11:** Explain LoRA and why it's useful for fine-tuning GenAI models.

**Q12:** How do techniques like PEFT and QLoRA reduce memory usage in training?

**Q13:** Describe the pipeline to fine-tune an LLM using instruction tuning and RLHF.

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### 5. Multimodal Model Integration

**Q14:** What are the challenges of integrating image and text inputs in a single model?

**Q15:** Describe how CLIP models align vision and language. How are they used in retrieval systems?

**Q16:** Design a multimodal input pipeline to process OCR + image captioning for a social app.

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## 6. Evaluation Metrics and Debugging

Q17: How do you evaluate factual accuracy in generative models?

Q18: What's the difference between BLEU, ROUGE, and BERTScore?

Q19: Write a debugging plan for an LLM that's giving inconsistent outputs for the same input.

Q20: How can you detect and reduce hallucination in open-ended answers?

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## 7. Ethics, Bias, and Safety in GenAI

Q21: How would you audit a model for gender or racial bias?

Q22: What is prompt injection? How can it be mitigated?

Q23: How do AI alignment and safety differ from traditional AI fairness principles?

Q24: Write an ethical risk analysis for a GenAI-powered hiring assistant.

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## 8. System Design Questions

Q25: Design a scalable GenAI-powered chat system for WhatsApp.

Q26: What caching strategies would you use to reduce latency in LLM API calls?

Q27: Architect a secure prompt-routing backend for a multi-model GenAI assistant.

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## 9. Real-World Case Study Questions

**Q28:** Meta wants to summarize Instagram DMs using LLMs. What approach would you take?

**Q29:** Google wants to build an LLM-based classroom assistant. List the pipeline stages from input to feedback.

**Q30:** Twitter (X) wants to auto-generate trending topics from tweets. Build the system pipeline.

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## 10. Coding Exercises – Python & GenAI APIs

**Q31:** Use Hugging Face `transformers` to load and query a BERT model.

```
from transformers import pipeline
qa = pipeline("question-answering", model="distilbert-base-cased-distilled-squad")
qa({"question": "What's the capital of France?", "context": "Paris is the capital of France."})
```

**Q32:** Write a Python script that uses OpenAI API to summarize an article.

**Q33:** Write a tokenizer that splits text into overlapping n-grams.

**Q34:** Build a Flask API that takes a question and returns a GPT-4 answer.

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## 11. API Design for GenAI Products

**Q35:** Design a RESTful API for prompt generation and storage.

**Q36:** How would you version and A/B test GenAI APIs in production?

**Q37:** Discuss the tradeoffs between serverless and containerized GenAI model inference.

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## 12. Deployment and Scaling

Q38: What strategies would you use to deploy LLMs on edge devices?

Q39: How do you cache LLM embeddings at scale?

Q40: Compare vector DBs like Pinecone, Weaviate, and FAISS.

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## 13. Research & Product Strategy

Q41: How would you pitch a GenAI assistant for enterprise documentation workflows?

Q42: How do you measure the success of a GenAI feature in a social media app?

Q43: Propose a roadmap for a multi-year GenAI research product.

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## 14. Open-Ended Thought Exercises

Q44: Where do you see GenAI heading in the next five years?

Q45: What unsolved problems excite you most in the GenAI space?

Q46: Would you rather fine-tune a domain-specific model or use RAG? Why?

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## 15. Additional Resources

- Hugging Face Course: <https://huggingface.co/course>
  - OpenAI Cookbook: <https://github.com/openai/openai-cookbook>
  - DeepLearning.AI's GenAI specialization
  - Google's Model Garden and Gemini Playground
  - Microsoft's Phi-3 and Azure AI Studio
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**End of Document**

(Approx. 26 pages in formatted layout)