Papers/models/blogs across 10 fields in Al

Section 1: Frontier LLMs

- <u>GPT1</u>, <u>GPT2</u>, <u>GPT3</u>, <u>Codex</u>, <u>InstructGPT</u>, <u>GPT4</u> papers. Self explanatory. <u>GPT3.5</u>, <u>4o</u>, <u>o1</u>, and <u>o3</u> tended to have launch events and system cards instead.
- <u>Claude 3</u> and <u>Gemini 1</u> papers to understand the competition. Latest iterations are <u>Claude 3.5</u> <u>Sonnet</u> and <u>Gemini 2.0 Flash/Flash Thinking</u>. Also <u>Gemma 2</u>.
- <u>LLaMA 1</u>, <u>Llama 2</u>, <u>Llama 3</u> papers to understand the leading open models. You can also view <u>Mistral 7B</u>, <u>Mixtral</u> and <u>Pixtral</u> as a branch on the Llama family tree.
- DeepSeek <u>V1</u>, <u>Coder</u>, <u>MoE</u>, <u>V2</u>, <u>V3</u> papers.
 Leading (relatively) open model lab.
- <u>Apple Intelligence</u> paper. It's on every Mac and iPhone.

Papers/models/blogs across 10 fields in Al

Section 2: Benchmarks and Evals

- MMLU paper the main knowledge benchmark, next to GPQA and BIG-Bench. In 2025 frontier labs use MMLU Pro, GPQA Diamond, and BIG-Bench Hard.
- <u>MuSR</u> paper evaluating long context, next to
 <u>LongBench</u>, <u>BABILong</u>, and <u>RULER</u>. Solving <u>Lost in</u>

 <u>The Middle</u> and other issues with <u>Needle in a</u>
 <u>Haystack</u>.
- MATH paper a compilation of math competition problems. Frontier labs focus on <u>FrontierMath</u> and hard subsets of MATH: MATH level 5, <u>AIME</u>, <u>AMC10/AMC12</u>.
- <u>IFEval</u> paper the leading instruction following eval and only external benchmark <u>adopted by Apple</u>. You could also view <u>MT-Bench</u> as a form of IF.
- ARC AGI challenge a famous abstract reasoning "IQ test" benchmark that has lasted far longer than many quickly saturated benchmarks.

Papers/models/blogs across 10 fields in Al

Section 3: Prompting, ICL & Chain of Thought

- The Prompt Report paper a survey of prompting papers
- <u>Chain-of-Thought</u> paper one of multiple claimants to popularizing Chain of Thought, along with <u>Scratchpads</u> and <u>Let's Think Step By Step</u>
- Tree of Thought paper introducing lookaheads and backtracking (podcast)
- <u>Prompt Tuning</u> paper you may not need prompts if you can do <u>Prefix-Tuning</u>, <u>adjust decoding</u> (say <u>via</u> <u>entropy</u>), or <u>representation engineering</u>
- <u>Automatic Prompt Engineering</u> paper it is increasingly obvious that humans are terrible zeroshot prompters and prompting itself can be enhanced by LLMs. The most notable implementation of this is in the <u>DSPy</u> <u>paper</u>/framework.

Papers/models/blogs across 10 fields in Al

Section 4: Retrieval Augmented Generation

- Introduction to Information Retrieval
- 2020 Meta RAG paper which coined the term. The original authors have started Contextual and have coined RAG 2.0. Modern "table stakes" for RAG HyDE, chunking, rerankers, multimodal data are better presented elsewhere.
- MTEB paper known overfitting that its author considers it dead, but still de-facto benchmark. Many embeddings have papers pick your poison SentenceTransformers, OpenAI, Nomic Embed, Jina v3, cde-small-v1, ModernBERT Embed with Matryoshka embeddings increasingly standard.
- <u>GraphRAG</u> paper <u>Microsoft's</u> take on adding knowledge graphs to RAG, <u>now open sourced</u>. One of the <u>most popular trends in RAG</u> in 2024, alongside of <u>ColBERT</u>/ColPali/ColQwen (more in the Vision section).
- RAGAS paper the simple RAG eval recommended by OpenAI.

Papers/models/blogs across 10 fields in Al

Section 5: Agents

- <u>SWE-Bench</u> paper. After <u>adoption by Anthropic</u>, Devin and <u>OpenAI</u>, probably the highest profile agent benchmark today (vs <u>WebArena</u> or <u>SWE-Gym</u>). Technically a coding benchmark, but more a test of agents than raw LLMs. See also <u>SWE-Agent</u>, <u>SWE-Bench Multimodal</u> and the <u>Konwinski Prize</u>.
- <u>ReAct</u> paper- ReAct started a long line of research on tool using and function calling LLMs, including <u>Gorilla</u> and the <u>BFCL Leaderboard</u>. Of historical interest - <u>Toolformer</u> and <u>HuggingGPT</u>.
- MemGPT paper one of many notable approaches to emulating long running agent memory, adopted by <u>ChatGPT</u> and <u>LangGraph</u>. Versions of these are reinvented in every agent system from <u>MetaGPT</u> to <u>AutoGen</u> to <u>Smallville</u>.
- <u>Voyager</u> paper Nvidia's take on 3 <u>cognitive architecture</u> components (curriculum, skill library, sandbox) to improve performance. More abstractly, skill library/curriculum can be abstracted as a form of <u>Agent Workflow Memory</u>.
- Anthropic on <u>Building Effective Agents</u>

Papers/models/blogs across 10 fields in Al

Section 6: Code Generation

- The Stack paper the original open dataset twin of The Pile focused on code, starting a great lineage of open codegen work from <u>The Stack v2</u> to <u>StarCoder</u>.
- Open Code Model papers choose from <u>DeepSeek-Coder</u>, <u>Qwen2.5-Coder</u>, or <u>CodeLlama</u>. Many regard <u>3.5 Sonnet as</u> <u>the best code model</u> but it has no paper.
- HumanEval/Codex paper This is a saturated benchmark, but is required knowledge for the code domain. SWE-Bench is more famous for coding now, but is expensive/evals agents rather than models. Modern replacements include <u>Aider</u>, <u>Codeforces</u>, <u>BigCodeBench</u>, <u>LiveCodeBench</u> and <u>SciCode</u>.
- <u>AlphaCodeium paper</u> Google published <u>AlphaCode</u> and <u>AlphaCode2</u> which did very well on programming problems, but here is one way Flow Engineering can add a lot more performance to any given base model.
- <u>CriticGPT</u> paper LLMs are <u>known</u> to generate code that can have security issues. OpenAI trained CriticGPT to spot them, and Anthropic <u>uses SAEs to identify LLM features</u> that cause this, but it is a problem you should be aware of.

Papers/models/blogs across 10 fields in Al

Section 7: Vision

- Non-LLM Vision work is still important: e.g. the <u>YOLO</u> paper (now <u>up to v11</u>, but <u>mind the lineage</u>), but increasingly transformers like <u>DETRs Beat</u> <u>YOLOs</u> too.
- <u>CLIP</u> paper the first successful <u>ViT</u> from Alec Radford. These days, superceded by <u>BLIP/BLIP2</u> or <u>SigLIP/PaliGemma</u>, but still required to know.
- MMVP benchmark (LS Live) quantifies important issues with CLIP. Multimodal versions of MMLU (MMMU) and SWE-Bench do exist.
- <u>Segment Anything Model</u> and <u>SAM 2</u> paper (<u>our pod</u>) the very successful image and video segmentation foundation model. Pair with <u>GroundingDINO</u>.
- Early fusion research: Contra the cheap "late fusion" work like <u>LLaVA</u> (<u>our pod</u>), early fusion covers Meta's <u>Flamingo</u>, <u>Chameleon</u>,

Papers/models/blogs across 10 fields in Al

Section 8: Voice

- Whisper paper the successful ASR model from Alec Radford. Whisper v2, v3 and distil-whisper and v3 Turbo are open weights but have no paper.
- <u>AudioPaLM</u> paper our last look at Google's voice thoughts before PaLM became Gemini. See also: Meta's <u>Llama 3</u> <u>explorations into speech</u>.
- NaturalSpeech paper one of a few leading TTS approaches. Recently <u>v3</u>.
- <u>Kyutai Moshi</u> paper an impressive fullduplex speech-text open weights model with <u>high profile demo</u>. See also <u>Hume</u> OCTAVE.
- OpenAl Realtime API: The Missing Manual -

Papers/models/blogs across 10 fields in Al

Section 9: Image/Video Diffusion

- <u>Latent Diffusion</u> paper effectively the Stable Diffusion paper.
- DALL-E / DALL-E-2 / DALL-E-3 paper OpenAl's image generation.
- <u>Imagen / Imagen 2</u> / <u>Imagen 3</u> paper Google's image gen. See also <u>Ideogram</u>.
- Consistency Models paper this distillation work with <u>LCMs</u> spawned the <u>quick draw viral moment of Dec 2023</u>.
 These days, updated with <u>sCMs</u>.
- Sora blogpost text to video no paper of course beyond the DiT paper

Papers/models/blogs across 10 fields in Al

Section 10: Finetuning

- LoRA/QLoRA paper the de facto way to finetune models cheaply, whether on local models or with 4o (confirmed on pod). FSDP+QLoRA is educational.
- <u>DPO</u> paper the popular, if slightly inferior, alternative to <u>PPO</u>, now supported by OpenAl as <u>Preference Finetuning</u>.
- <u>ReFT</u> paper instead of finetuning a few layers, focus on features instead.
- Orca 3/AgentInstruct paper see the Synthetic Data picks at NeurIPS but this is a great way to get finetue data.
- RL/Reasoning Tuning papers <u>RL Finetuning for o1</u> is debated, but <u>Let's Verify Step By Step</u> and <u>Noam Brown's many public talks</u> give hints for how it works.