

#### **Generative AI**

**GAN - Generative Adversarial Network** 

**VAE - Variational Autoencoder** 

GPT - Generative Pre-trained Transformer

**LSTM - Long Short-Term Memory** 

Al - Artificial Intelligence AR - Autoregressive Model

SVM -Support Vector Machine

#### **Machine Learning**

EDA -Exploratory Data Analysis

ML - Machine Learning RL - Reinforcement Learning

MSE - Mean Squared Error

DL - Deep Learning

NLP - Natural Language Processing PCA - Principal Component Analysis

**Data Science** 

AUC - Area Under the Curve

ROC - Receiver Operating Characteristic

NER - Named Entity Recognition

RNN - Recurrent Neural Network

### **Natural Language Processing**

CNN - Convolutional Neural Network

POS - Part of Speech

BERT - Bidirectional Encoder Representations from Transformers

loU - Intersection over Union

GAN - Generative Adversarial Network

**Computer Vision** 

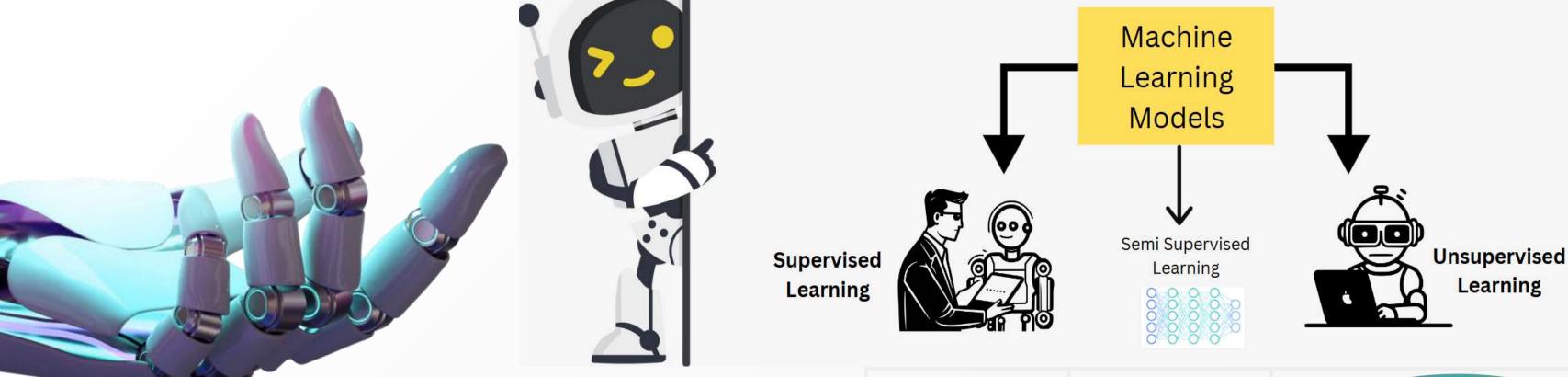
AR - Augmented Reality

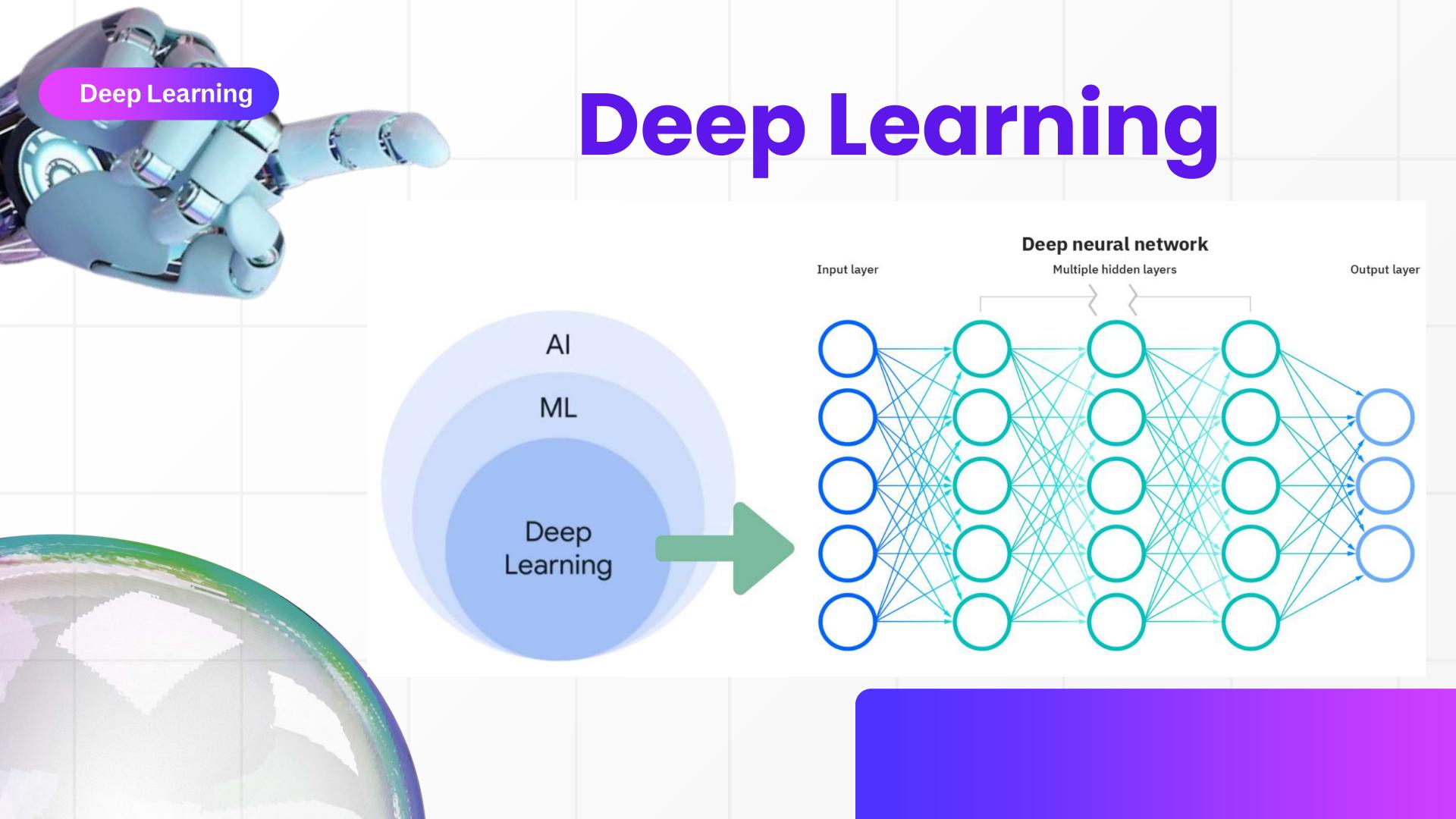




# Machine Learning

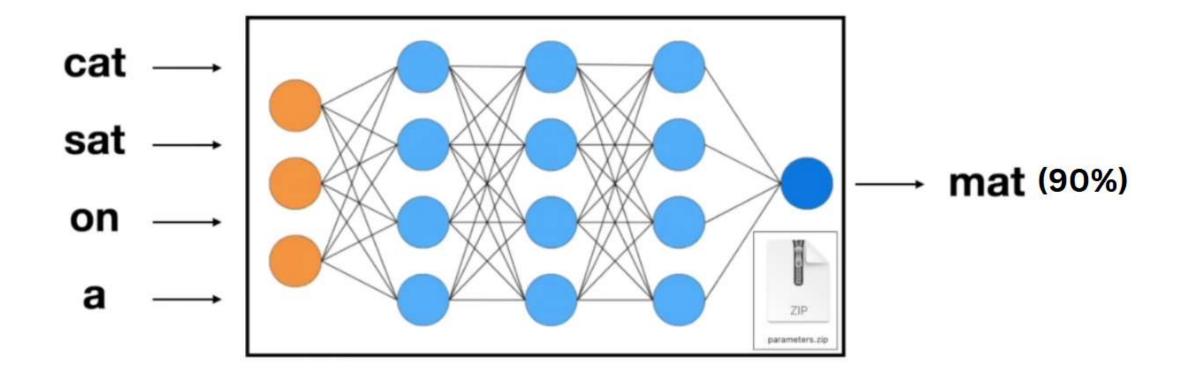






# **Neural Network**

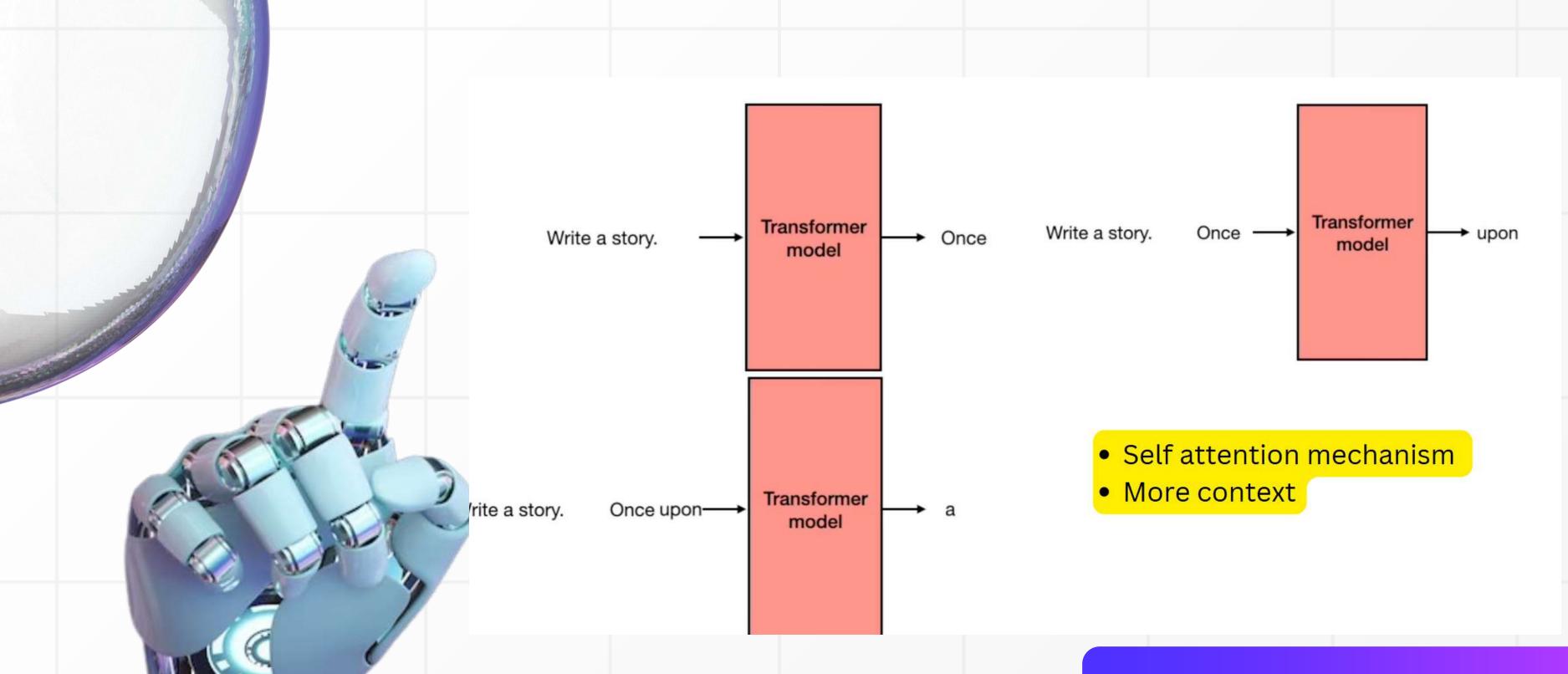
Predicts the next word in the sequence.



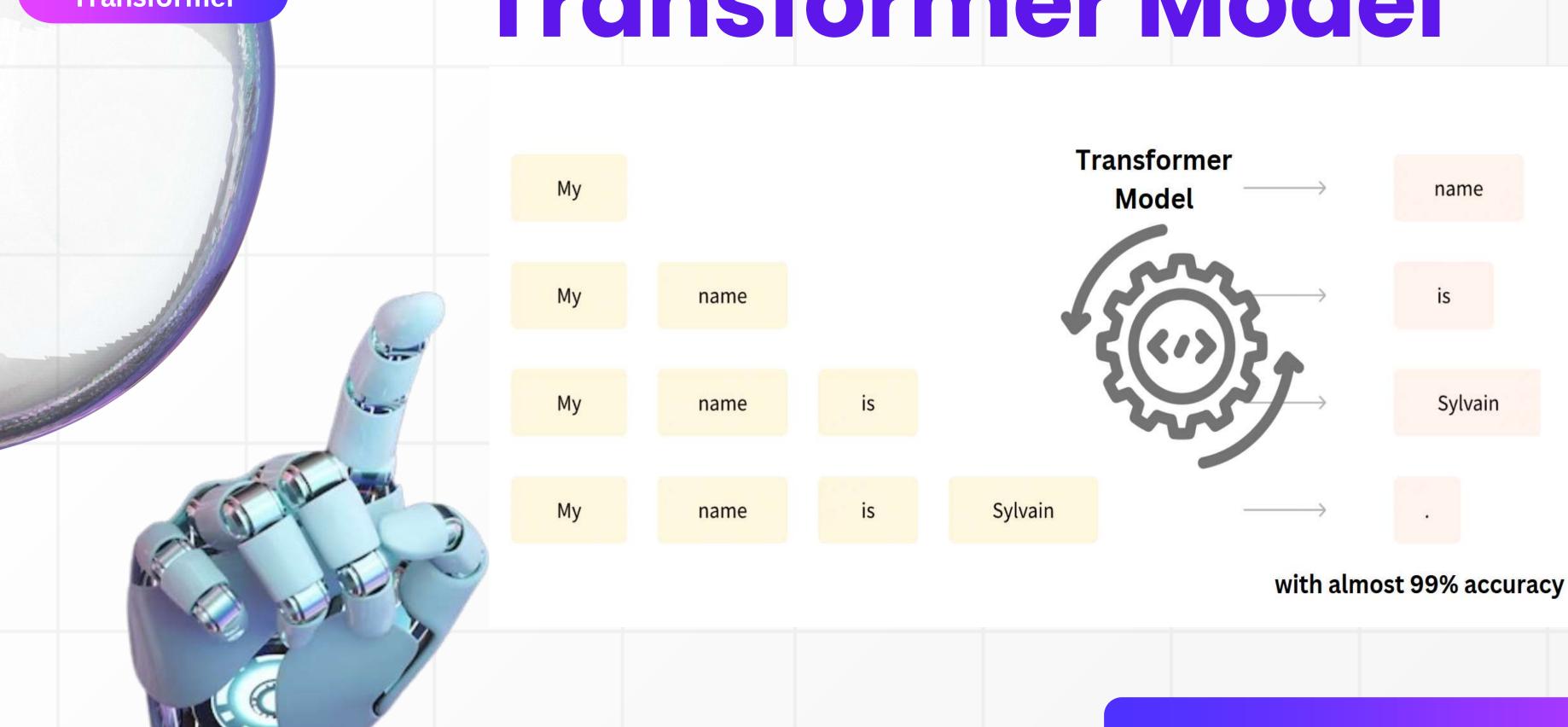
e.g. context of 4 words

predict next word

# Transformer Model

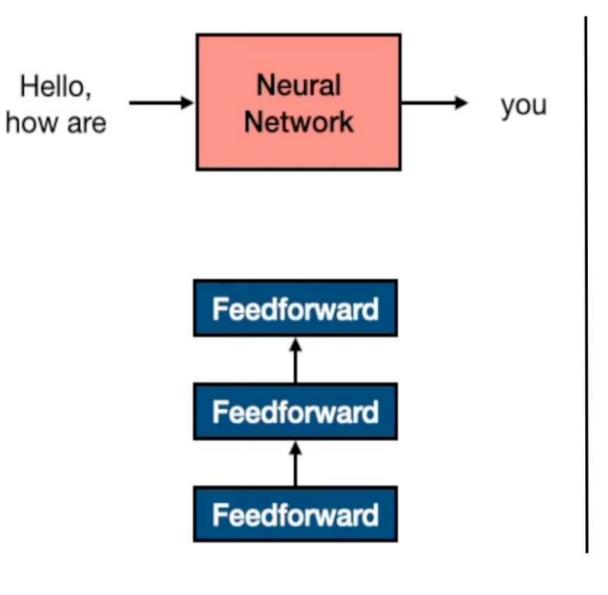


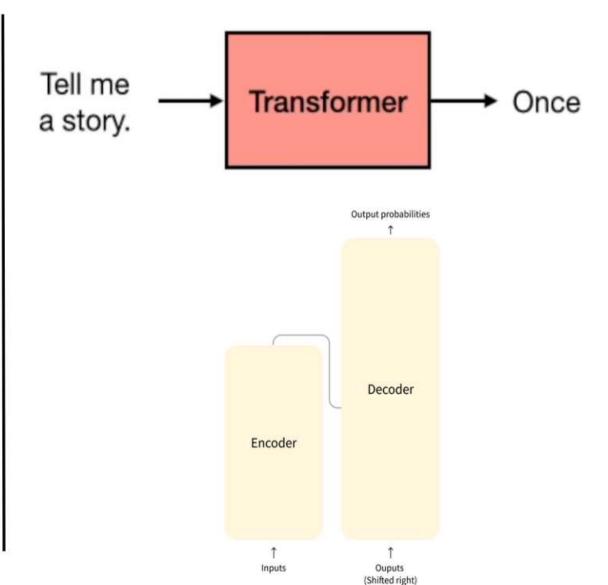
# Transformer Model



# Neural Network vs Transformer Model



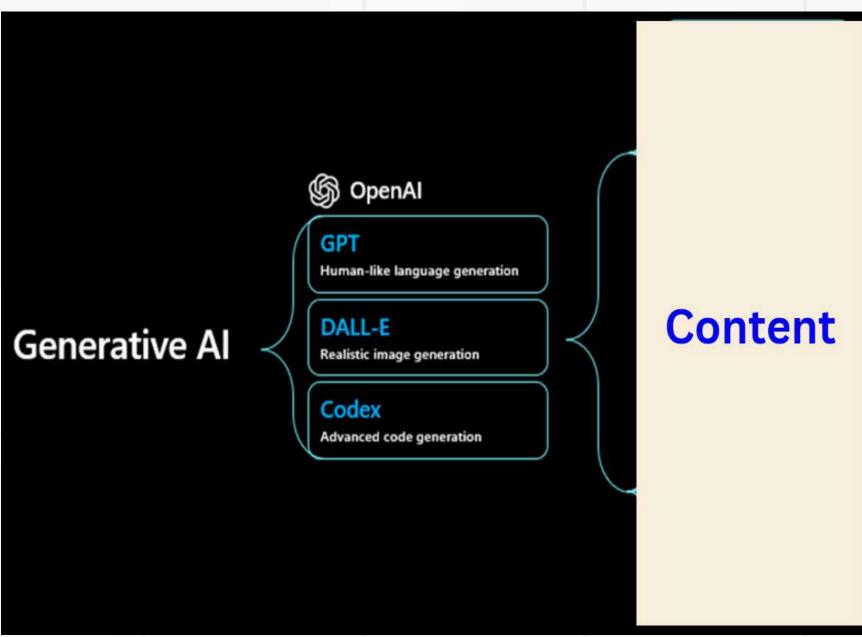


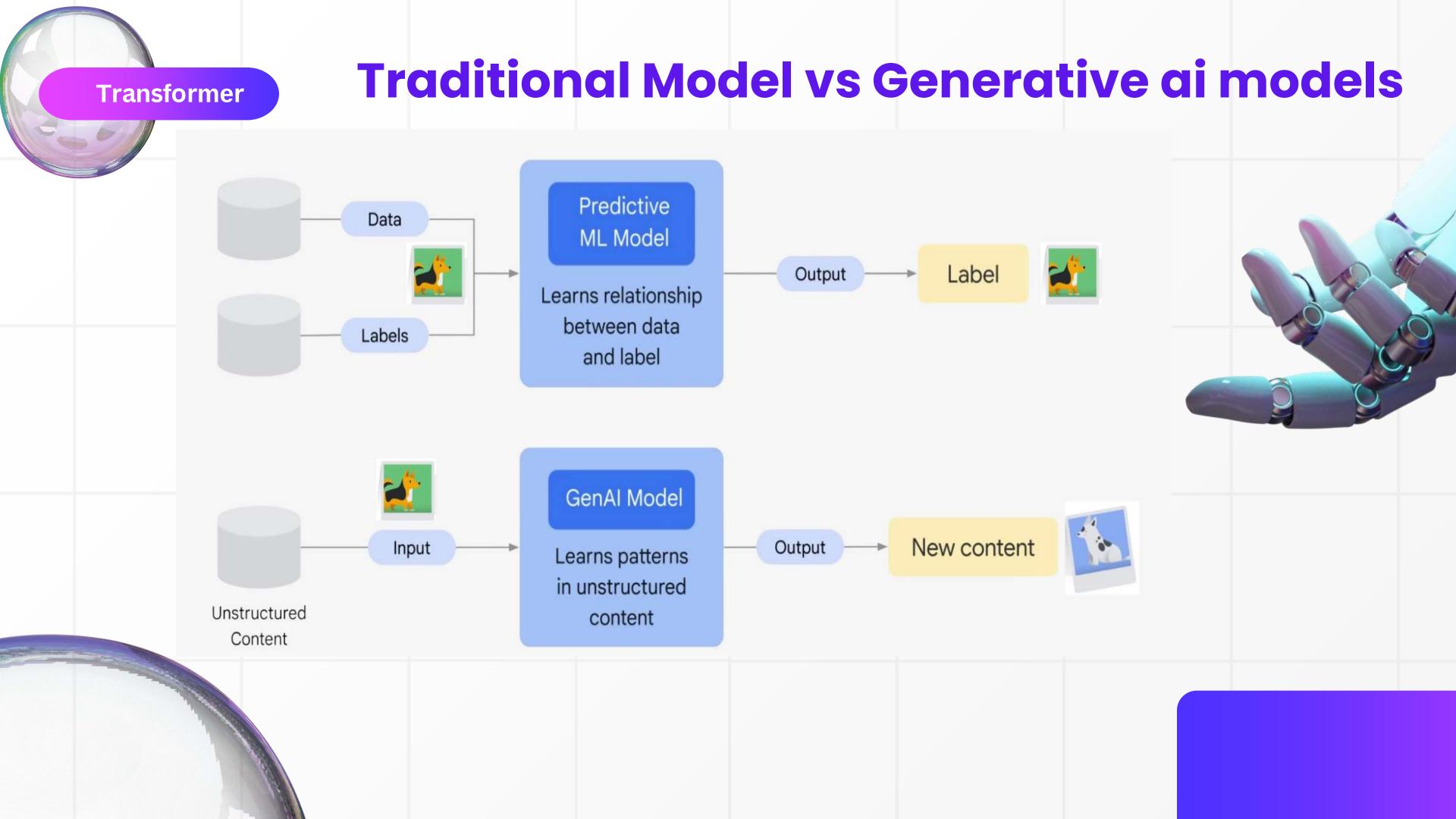


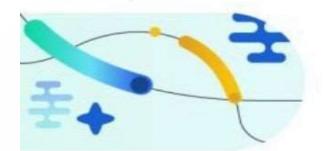
# Generative Al

Generative AI is a type of artificial intelligence technology that can produce various types of content, including text, imagery, audio and synthetic data.









### **Evolution of Al Architecture:**

### Traditional ML to Generative Al

#### Traditional ML



#### Data Pre-Processing

Cleaning and preparing data for analysis



#### **Feature Engineering**

Extracting important features from data



#### Training & Tuning

Training models on data and adjusting parameters for optimal performance



#### **Deployment & Monitoring**

Implementing models in real-world applications and monitoring their performance

#### Tech Stack for Traditional ML

- ML Frameworks: Keras, Theano
- ML API's & SDK: IBM Watson
- Database: SQL Server, Oracle
- ML Ops: Docker, Jenkins

## Generative Al



#### **Data Pre-Processing**

Cleaning and preparing data for analysis



#### **Prompt Engineering/Fine Tuning**

Designing effective prompts to guide Al in generating desired outputs



#### Foundational/Fine-Tuned LLM

Using foundation and Fine-tuned language models for sophisticated content generation



#### **Deployment & Monitoring**

Implementing models in real-world applications and monitoring their performance

#### **Tech Stack for Generative AI**

- Gen Al Orchestration: Langchain,
  Ilamaindex
- LLM Models: OpenAl, Anthropic
- Vector Database: Pinecone, Weaviate
- LLM Ops: Prompt Layer, Helicone



# Large Language Models





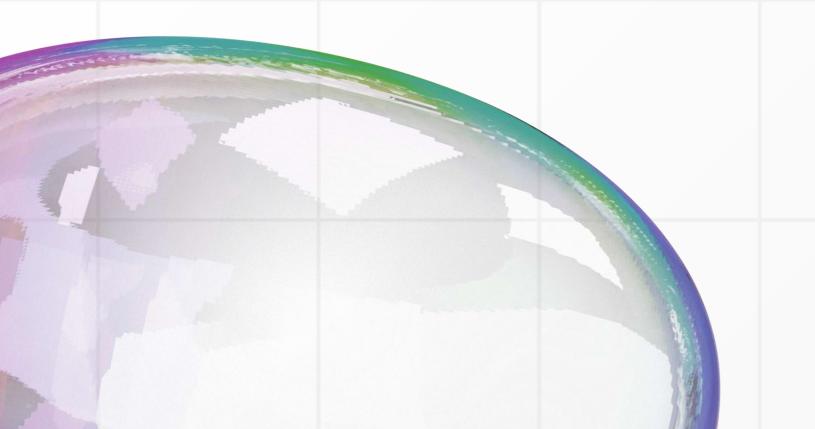






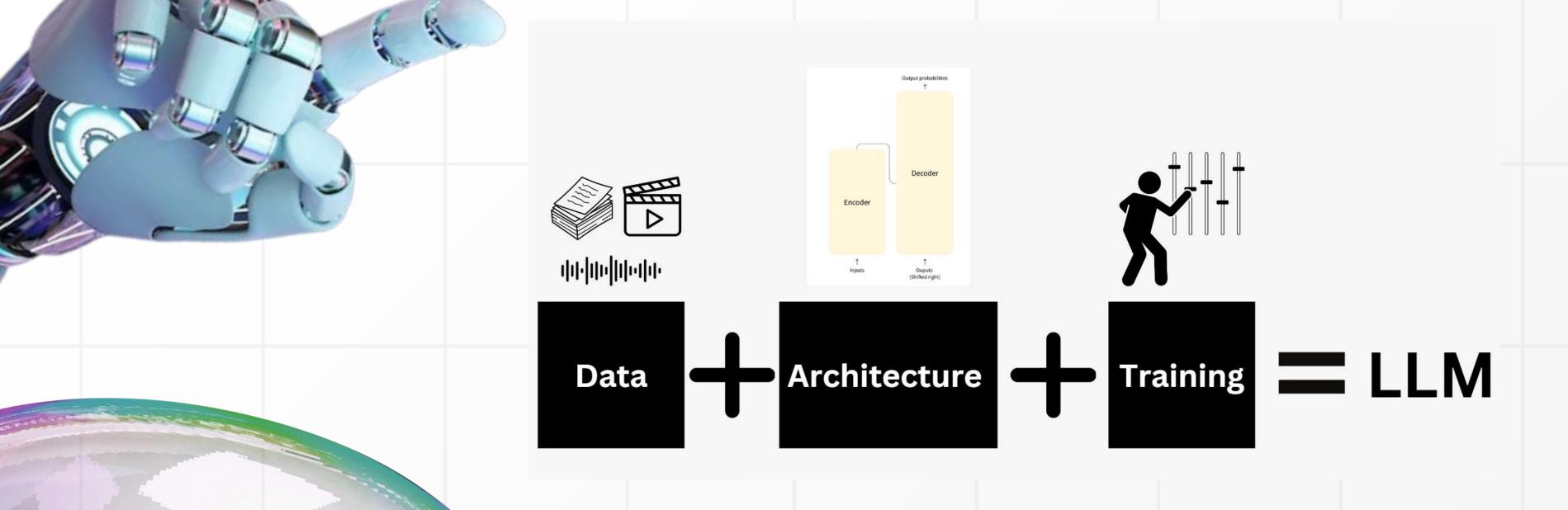


Generative AI applications are built using LLMs





# LLM Training



# Custom LLM Training



### Stage 1: Pretraining

- 1. Download ~10TB of text.
- 2. Get a cluster of ~6,000 GPUs.
- 3. Compress the text into a neural network, pay
- ~\$2M, wait ~12 days.
- 4. Obtain base model.



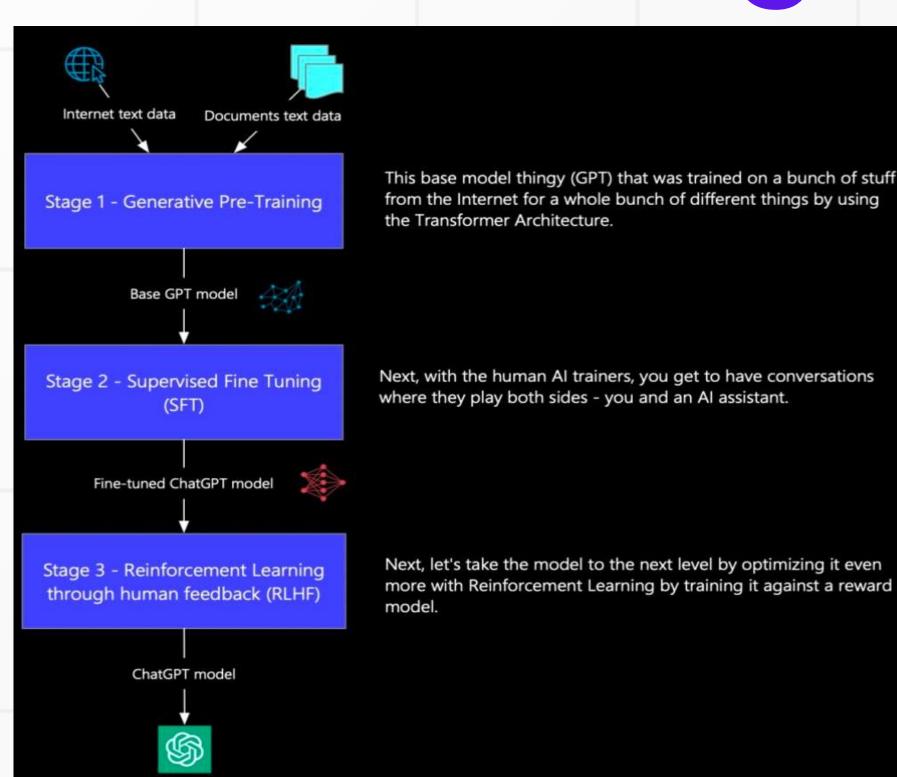
Can you write a short introduction about the resevence of the term "incringeony" in economics? Please use examples related to potential monopoonies in the labour market and otte relevant exeerch.

#### CASSISTANT>

"Monopsory" refers to a market structure where there is only one buyer for a particular good or service, in economics, this term is particularly resewart in the labor market, where a monopsory employer has significant power over the wages and working conditions of their employees. The presence of a monopsory can result in lower wages and reduced employment opportunities for workers, as the employer has little incentive to increase wages or provide before working conditions.

## Stage 2: Finetuning

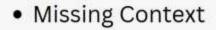
- 1. Write labeling instructions
- 2. Hire people (or use <u>scale.ai</u>!), collect 100K high quality ideal Q&A responses, and/or comparisons.
- 3. Finetune base model on this data, wait ~1 day.
- 4. Obtain assistant model.
- Run a lot of evaluations.
- 6. Deploy.
- 7. Monitor, collect misbehaviors, go to step 1.



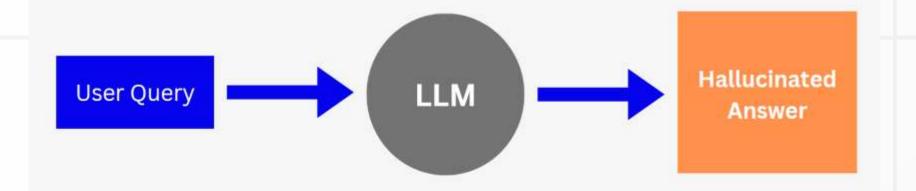




# LLM Hallucination



- Not tailored outputs
- Specialised vocabulary



- Fine tuning
- Prompt Engineering
- Retrieval Augmented Generation (RAG)



Model	Accuracy	Hallucination Rate	Answer Rate
GPT 4	97.0 %	3.0 %	100.0 %
GPT 3.5	96.5 %	3.5 %	99.6 %
Llama 2 70B	94.9 %	5.1 %	99.9 %
Llama 2 7B	94.4 %	5.6 %	99.6 %
Llama 2 13B	94.1 %	5.9 %	99.8 %
Cohere-Chat	92.5 %	7.5 %	98.0 %
Cohere	91.5 %	8.5 %	99.8 %
Anthropic Claude 2	91.5 %	8.5 %	99.3 %
Mistral 7B	90.6 %	9.4 %	98.7 %
Google Palm	87.9 %	12.1 %	92.4 %
Google Palm-Chat	72.8 %	27.2 %	88.8 %

# LLM Use case

## **Input Data**



Books and Literature of multiple Languages,



Online content - websites, news, blogs



Wikipedia

Social Media, Online chats and discussions



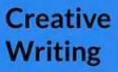




Adaptation

Large Language Model Bard/ChatGPT

## **Tasks**





**Answering** Questions



Text **Summarization** 



Language **Translation** 



Sentiment **Analysis** 

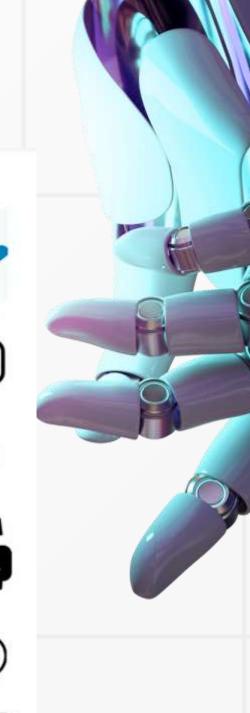


Interactive Conversation



Information Retrieval





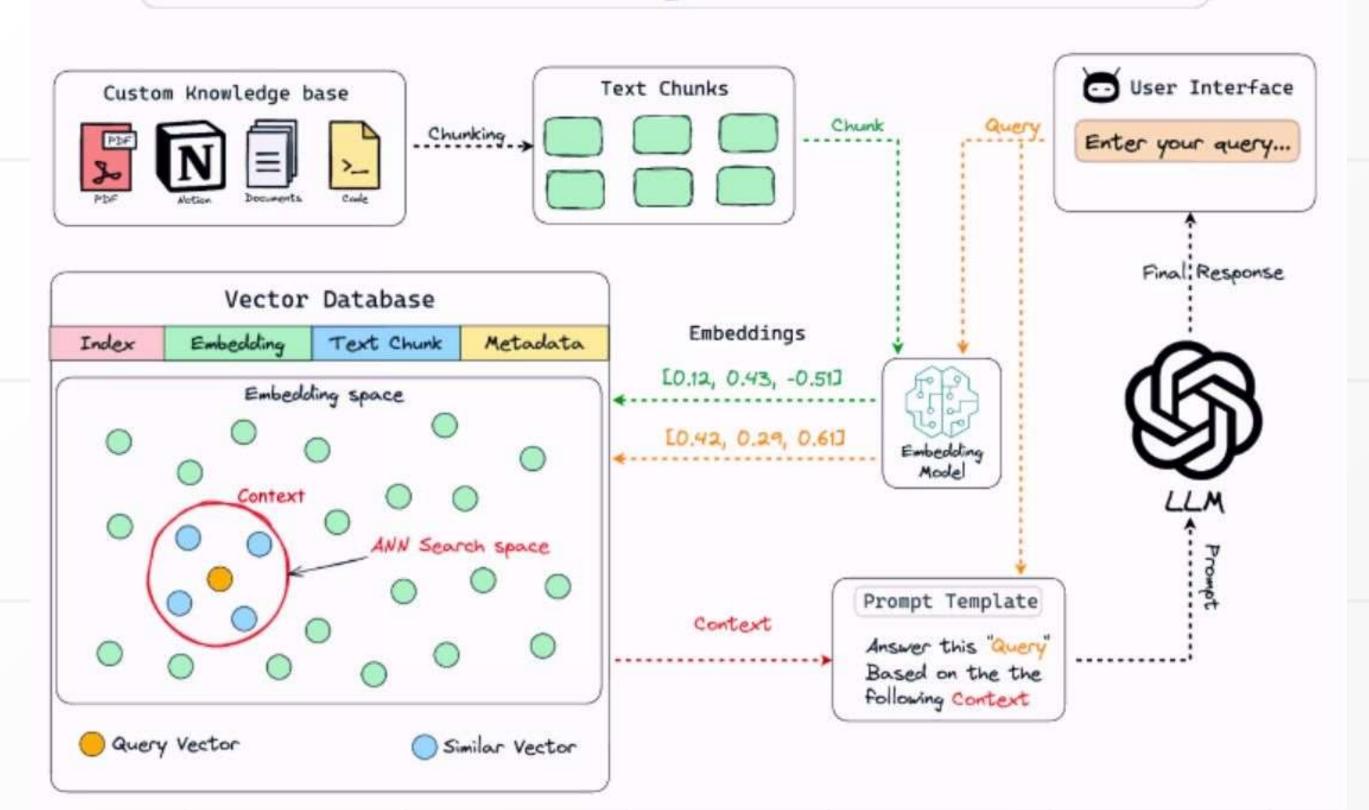






# Building RAG

RAG: Retrieval Augmented Generation



Project Architecture

