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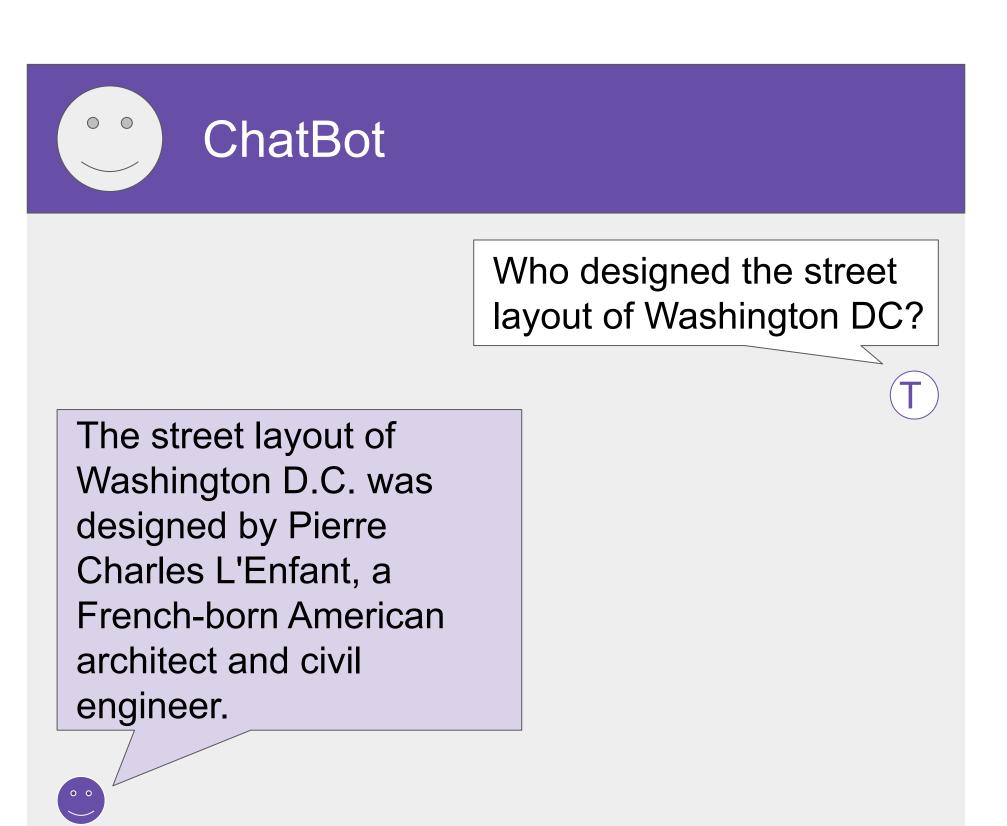




# Generative AI & Large Language Models (LLMs)

USE CASES,
PROJECT LIFECYCLE, AND
MODEL PRE-TRAINING

## Generative Al





## Generative Al





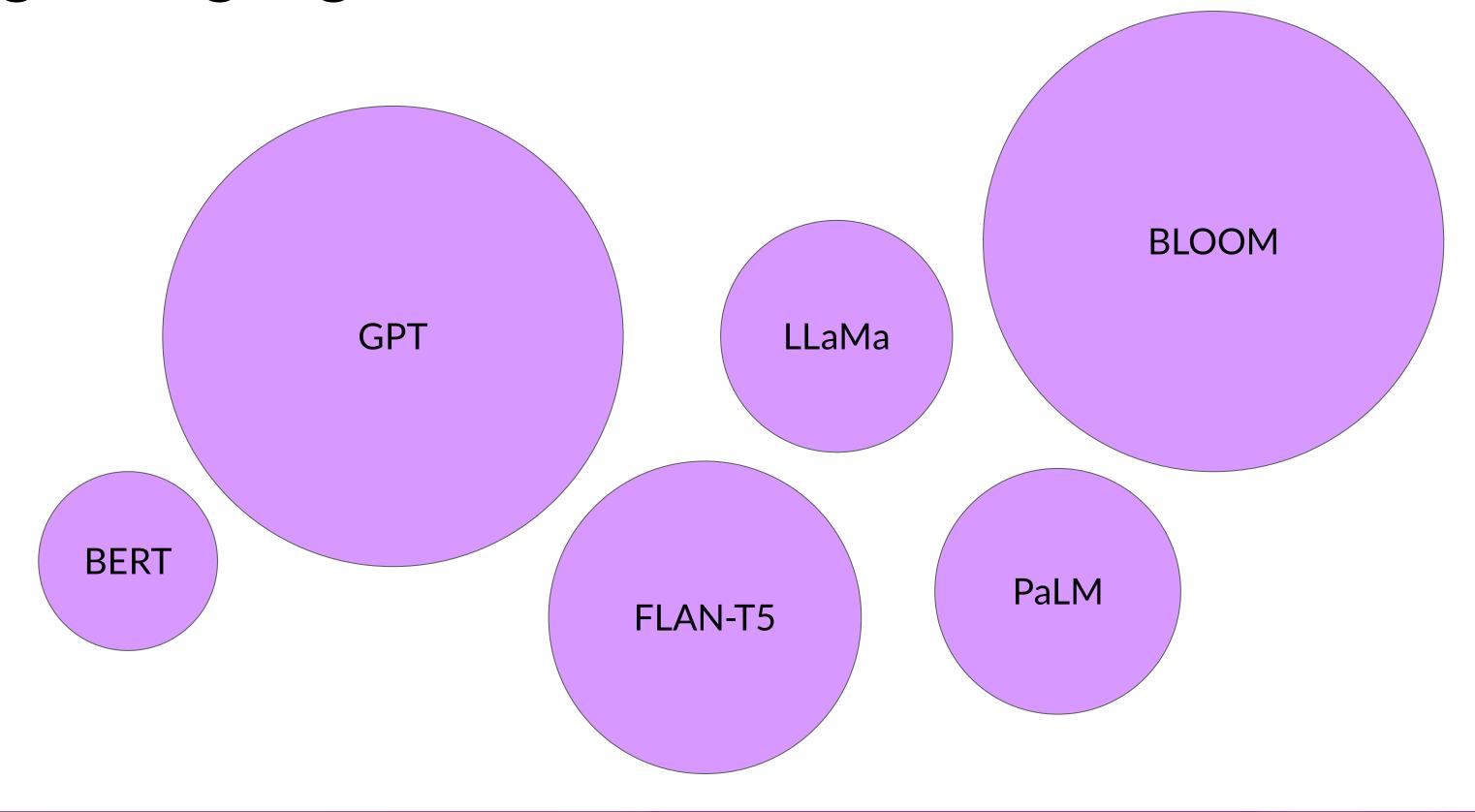


#### Generative Al

```
CodeAld
   def binary_search(arr, x, 1, r):_
      if r >= 1:
           mid = 1 + (r - 1) // 2
            if arr[mid] == x:
                return mid
           elif arr[mid] > x:
6
                return binary_search(arr, x, 1, mid - 1)
            else:
8
                return binary_search(arr, x, mid + 1, r)
       else:
                                                 < 1/2 > Accept
            return -1
Al Connected
        Run security scan
```



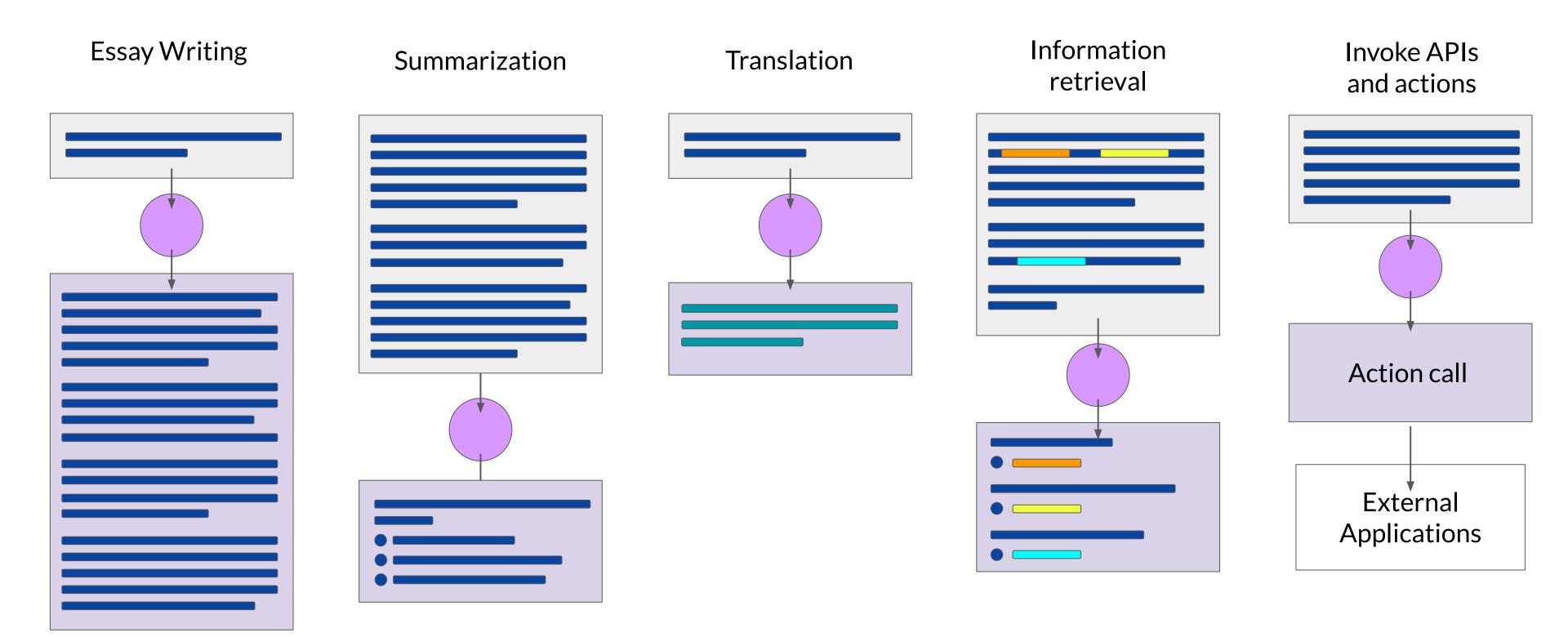
## Large Language Models







## LLM use cases & tasks



## The significance of scale: language understanding



BLOOM 176B

\*Bert-base



# How LLMs work -Transformers architecture





## Understanding language can be challenging

The teacher's book?

The teacher taught the student with the book.

The student's book?



#### Transformers

#### **Attention Is All You Need**

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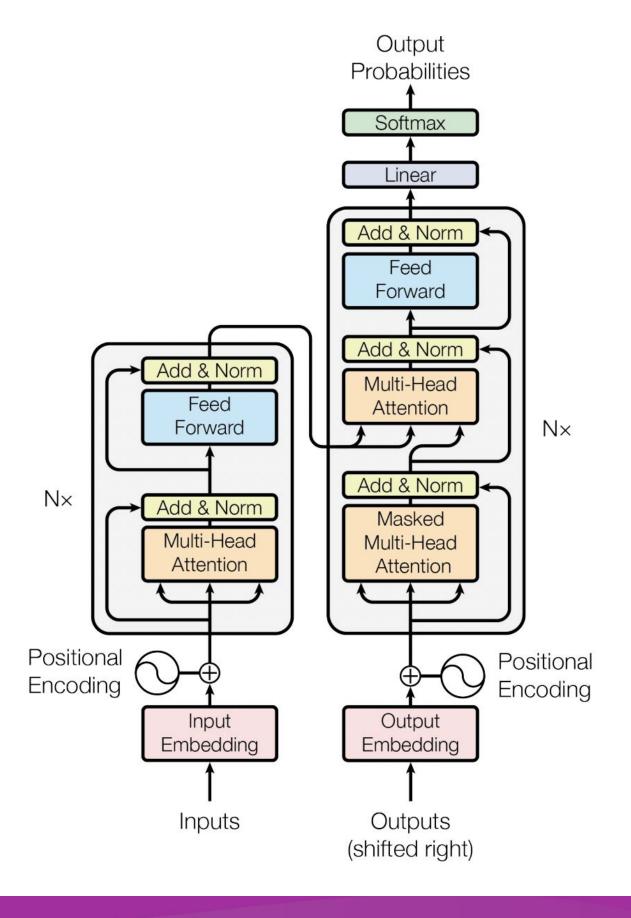
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#### **Abstract**

The dominant sequence transduction models are based on complex recurrent or convolutional neural networks that include an encoder and a decoder. The best performing models also connect the encoder and decoder through an attention mechanism. We propose a new simple network architecture, the Transformer, based solely on attention mechanisms, dispensing with recurrence and convolutions entirely. Experiments on two machine translation tasks show these models to







#### **Transformers**

#### **Attention Is All You Need**

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- Scale efficiently
- Parallel process
- Attention to input meaning





# Responsible Al





## Special challenges of responsible generative Al

- Toxicity
- Hallucinations
- Intellectual Property



## Toxicity

LLM returns responses that can be potentially harmful or discriminatory towards protected groups or protected attributes

#### How to mitigate?

- Careful curation of training data
- Train guardrail models to filter out unwanted content
- Diverse group of human annotators





## Hallucinations

LLM generates factually incorrect content

#### How to mitigate?

- Educate users about how generative AI works
- Add disclaimers
- Augment LLMs with independent, verified citation databases
- Define intended/unintended use cases



## Intellectual Property

Ensure people aren't plagiarizing, make sure there aren't any copyright issues

How to mitigate?

- Mix of technology, policy, and legal mechanisms
- Machine "unlearning"
- Filtering and blocking approaches





## Responsibly build and use generative AI models

- Define use cases: the more specific/narrow, the better
- Assess risks for each use case
- Evaluate performance for each use case
- Iterate over entire Al lifecycle

