

INTRODUCTION TO BERT

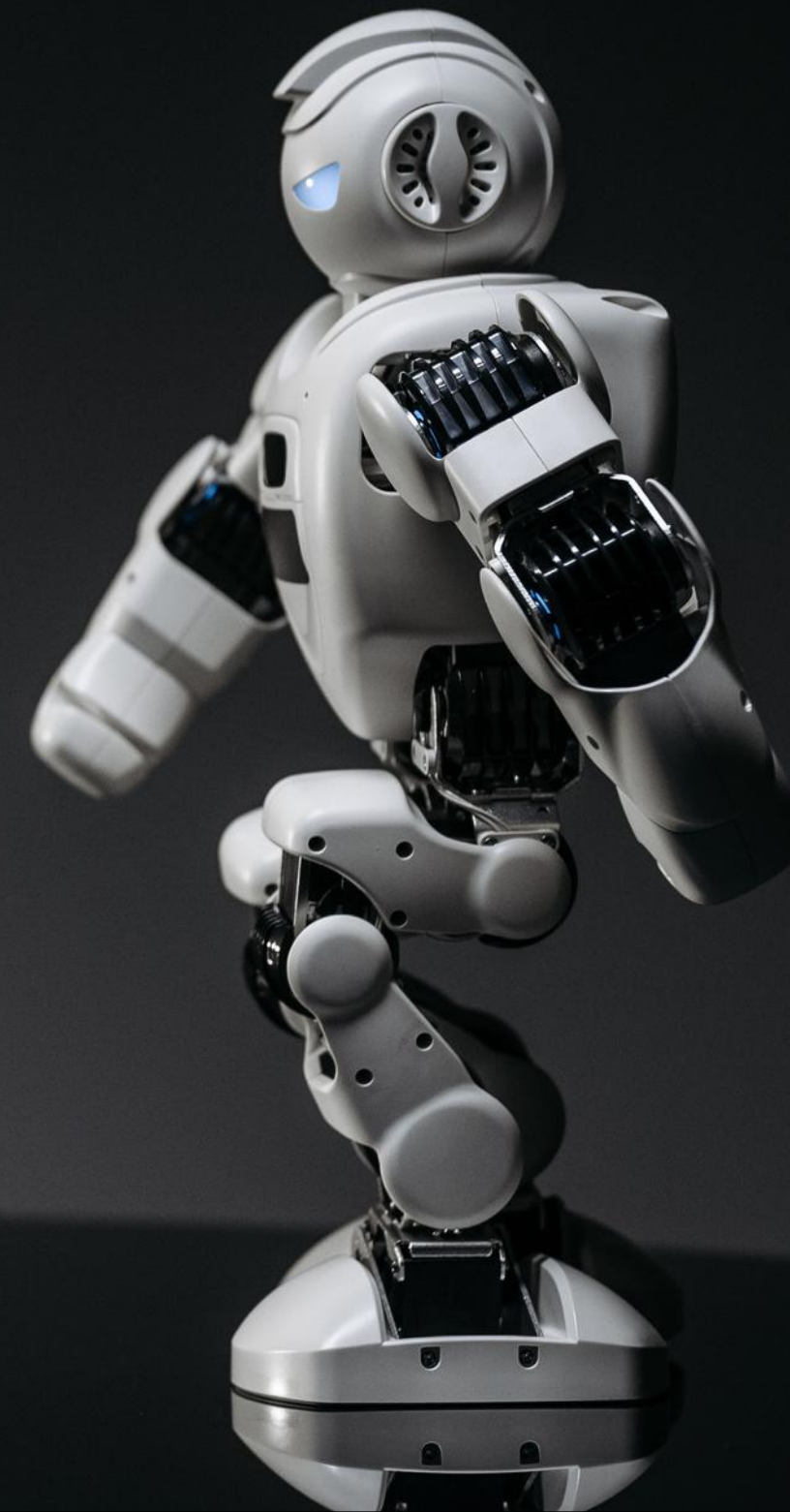
HASAN ABDELHADY

AIE - 400 - NLP

WHAT IS BERT?

BERT stands for **Bidirectional Encoder Representations from Transformers**. It's a model created by Google AI in 2018 to help computers understand human language better. It was a big breakthrough in the field of Natural Language Processing (NLP), which is all about teaching computers to read, understand, and respond to human language.

What is BERT?



WHAT IS BERT?

BERT WAS TRAINED ON:

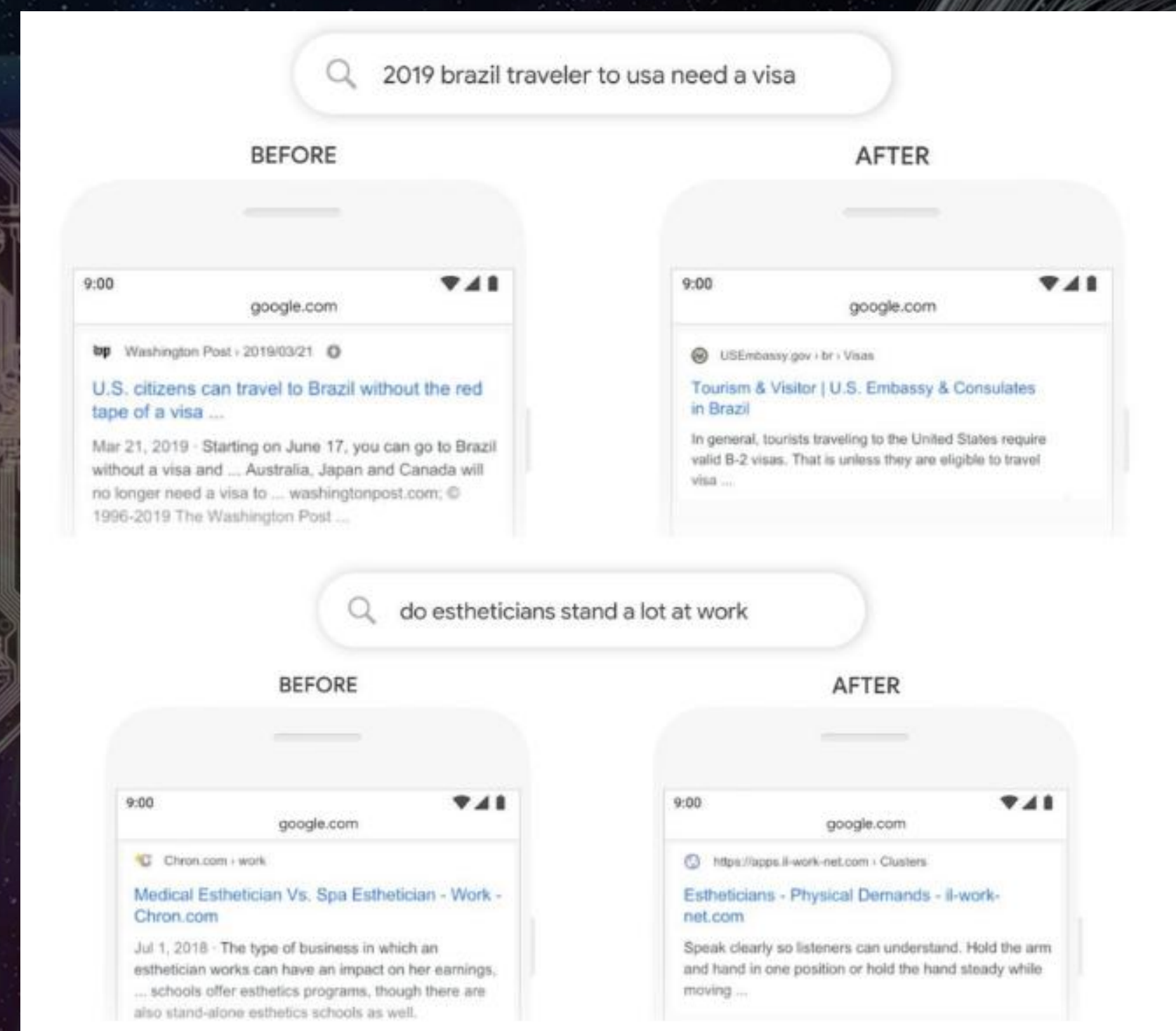
- THE ENTIRETY OF WIKIPEDIA
- 10s of thousands of books with a total of 3.3 Billion Words

Why BERT?

WHY BERT?

- Previous models read text one way (left-to-right or right-to-left)
- BERT reads text both ways for better context understanding
- Example: 'The bank is near the river'
 - Left to right misinterpretation

How Does BERT Work?



HOW DOES BERT WORK?

- Based on Transformer architecture (Good at analyzing text)
- Uses 'attention' to focus on important parts of sentences
- Reads text in both directions simultaneously (bidirectional)

Pretraining and Fine-tuning

Slide 05

```
7
8 .box{
9     position: absolute;
10    top: 50%;
11    left: 50%;
12    transform: translate(-50%,
13    width: 400px;
14    padding: 40px;
15    background: rgba(0, 0, 0,
16    box-sizing: border-box;
17    box-shadow: 0 15px 25px rgba(
18    border-radius: 10px;
19 }
20 .box h2{
21     margin: 0 0 30px;
22     padding: 0;
23     color: #fff;
24     text-align: center;
25 }
26 .box h3{
27     margin: 0 0 10px;
28     padding: 0;
29     color: #fff;
30     text-align: center;
31 }
32 .box .inputBox{
33     position: relative;
34 }
35 .box
```


PRETRAINING AND FINE-TUNING

- Pretraining: Learns basic language patterns from large text data
- Fine-tuning: Adjusted for specific tasks (e.g., sentiment analysis)
- Adaptable to various NLP applications

Applications of BERT

APPLICATIONS OF BERT

- Question Answering
- Text Classification (e.g., spam detection)
- Named Entity Recognition (NER)
- Sentiment Analysis

Why BERT is Special



WHY BERT IS SPECIAL

- Bidirectional reading enables deeper understanding
- Attention mechanism focuses on key words and relationships
- Pretrained on large datasets; adaptable to new tasks

Using BERT in Codepace



USING BERT IN YOUR CODESPACE

Slide 09

Installation

```
!pip install transformers torch
```

Import Libraries and Load BERT

```
from transformers import pipeline
```


SENTIMENT ANALYSIS

Slide 10

```
# Load the sentiment-analysis pipeline
classifier = pipeline("sentiment-analysis")

# Test the classifier
text = "I really love this product! It works perfectly."
result = classifier(text)
print(f"Input: {text}\nSentiment: {result[0]['label']}, Score: {result[0]['score']:.2f}")
```

```
Input: I really love this product! It works perfectly.
Sentiment: POSITIVE, Score: 1.00
```


QUESTION ANSWERING

Slide 12

```
# Load the question-answering pipeline
qa_pipeline = pipeline("question-answering")

# Define a context passage
context = """
BERT is a model developed by Google that understands language in both directions.
It was a breakthrough in NLP and is widely used for tasks like question answering and sentiment analysis.
"""

# Ask a question based on the context
question = "Who developed BERT?"
result = qa_pipeline(question=question, context=context)
print(f"Question: {question}\nAnswer: {result['answer']}")
```

Question: Who developed BERT?
Answer: Google

QUESTION ANSWERING

Slide 12

```
3 # Load the question-answering pipeline
4 qa_pipeline = pipeline("question-answering")
5
6 # Define a context passage
7 context = """
8 BERT is a model developed by Ahmed Oraby that understands language in both directions.
9 It was a breakthrough in NLP and is widely used for tasks like question answering and sentiment analysis.
10 """
11
12 # Ask a question based on the context
13 question = "Who developed BERT?"
14 result = qa_pipeline(question=question, context=context)
15 print(f"Question: {question}\nAnswer: {result['answer']}")
16
```

Question: Who developed BERT?
Answer: Ahmed Oraby

FEATURE SIMILARITY

Slide 12

```
3 # Load the feature-extraction pipeline to get sentence embeddings
4 feature_extractor = pipeline("feature-extraction")
5
6 # Define two sentences
7 sentence1 = "BERT is a powerful model for NLP."
8 sentence2 = "BERT is great for understanding language."
9
10 # Get embeddings for each sentence
11 embedding1 = feature_extractor(sentence1)[0]
12 embedding2 = feature_extractor(sentence2)[0]
13
14 # Compute a simple similarity score (cosine similarity)
15 import torch
16 embedding1 = torch.tensor(embedding1).mean(dim=0)
17 embedding2 = torch.tensor(embedding2).mean(dim=0)
18 cosine_similarity = torch.nn.functional.cosine_similarity(embedding1, embedding2, dim=0)
19
20 print(f"Similarity Score between sentences: {cosine_similarity.item():.2f}")
21
```

Similarity Score between sentences: 0.93

The image features two advanced, bipedal robots standing on a dark, reflective floor. The robot on the left is smaller and has a more compact, boxy head with two prominent red vertical light bars. The robot on the right is larger and has a more elongated, rectangular head with a single red light bar on its side. Both robots have a complex mechanical body with visible joints, gears, and various sensors. They are both equipped with thin, wire-like antennas. The scene is dimly lit, with the primary light source being the red LEDs on the robots, which cast a soft glow and create clear reflections on the floor. The overall aesthetic is high-tech and futuristic.

THANK YOU
FOR YOUR *ATTENTION*