UNDERSTANDING EMPATHY EXPRESSED IN TEXT-BASED MENTAL HEALTH SUPPORT



BACKGROUND

APPROXIMATELY **20% OF PEOPLE WORLDWIDE** ARE SUFFERING FROM A MENTAL HEALTH DISORDER. (HOLMES ET Al., 2018)

MILLIONS OF PEOPLE ARE TURNING TO TEXT-BASED
PEER SUPPORT PLATFORMS.



HOW TO MEASURE EMPATH?

EPITOME

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EMOTIONAL REACTIONS

INTERPRETATIONS

EXPLORATIONS

OUTCOMES



- (0) peers not expressing them at all (nocommunication)
- (1) peers expressing them to some weak degree (weak communication)
- (2) peers expressing them strongly (strong communication)

DATA

- TALKLIFE
- MENTAL HEALTH
 SUBREDDITS
- CROWDWORKERS
 RECRUITING AND
 TRAINING



10,143 ROWS OF DATA

MODEL



Let $\mathbf{S}_i = s_{i1},...,s_{im}$ be a seeker post and $\mathbf{R}_i = r_{i1},...,r_{in}$ be a corresponding response post.

• EMPATHY IDENTIFICATION

Identify howempathic \mathbf{R}_i is in the context of \mathbf{S}_i .

RATIONALE
 EXTRACTION

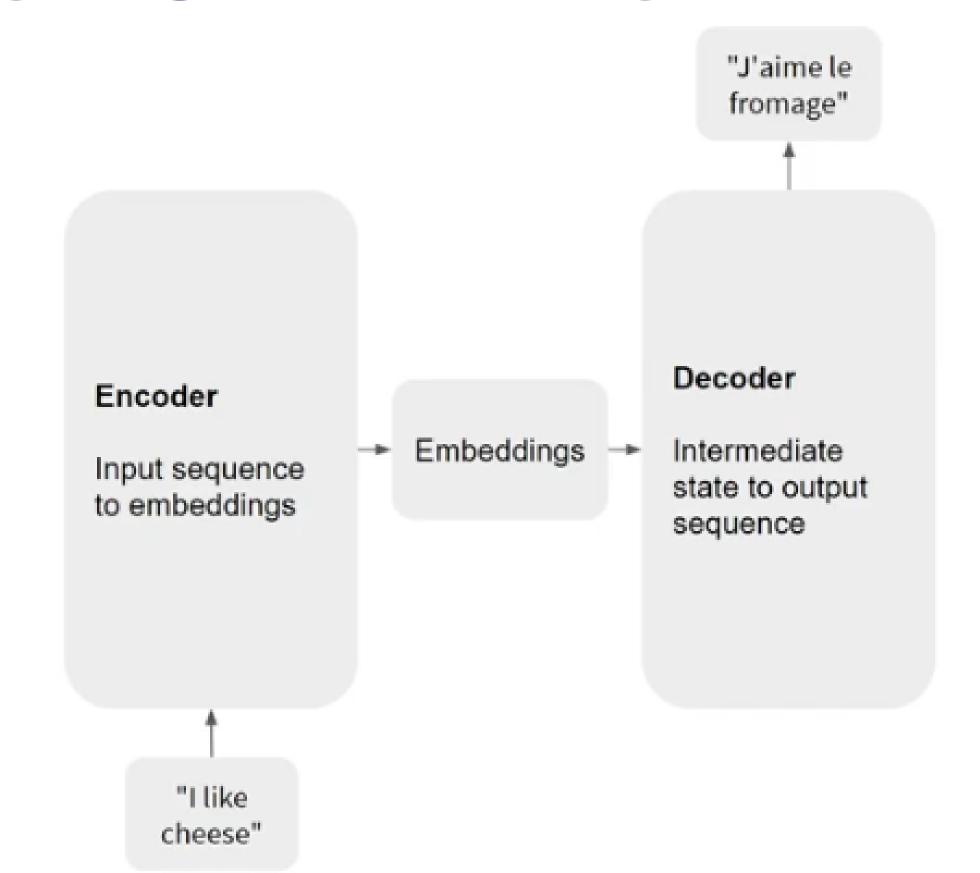
Extract rationales underlying the identified level l_i

ROBERTA

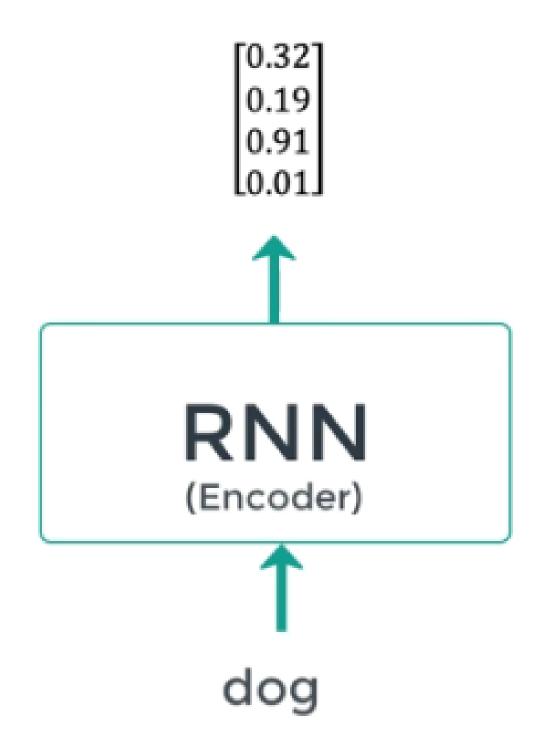


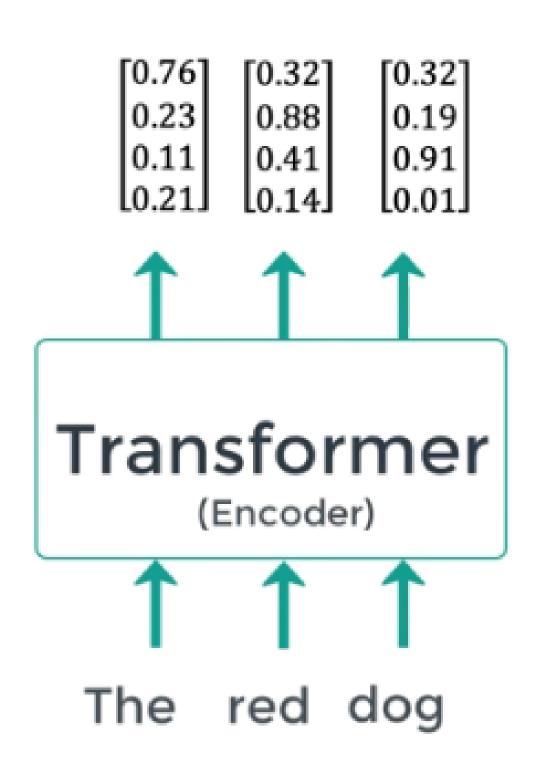
- Robustly optimized BERT approach
- **BERT** (Bidirectional Encoder Representations from Transformers) is a revolutionary self-supervised pretraining technique that learns to predict intentionally hidden (masked) sections of text.

TRANSFORMERS

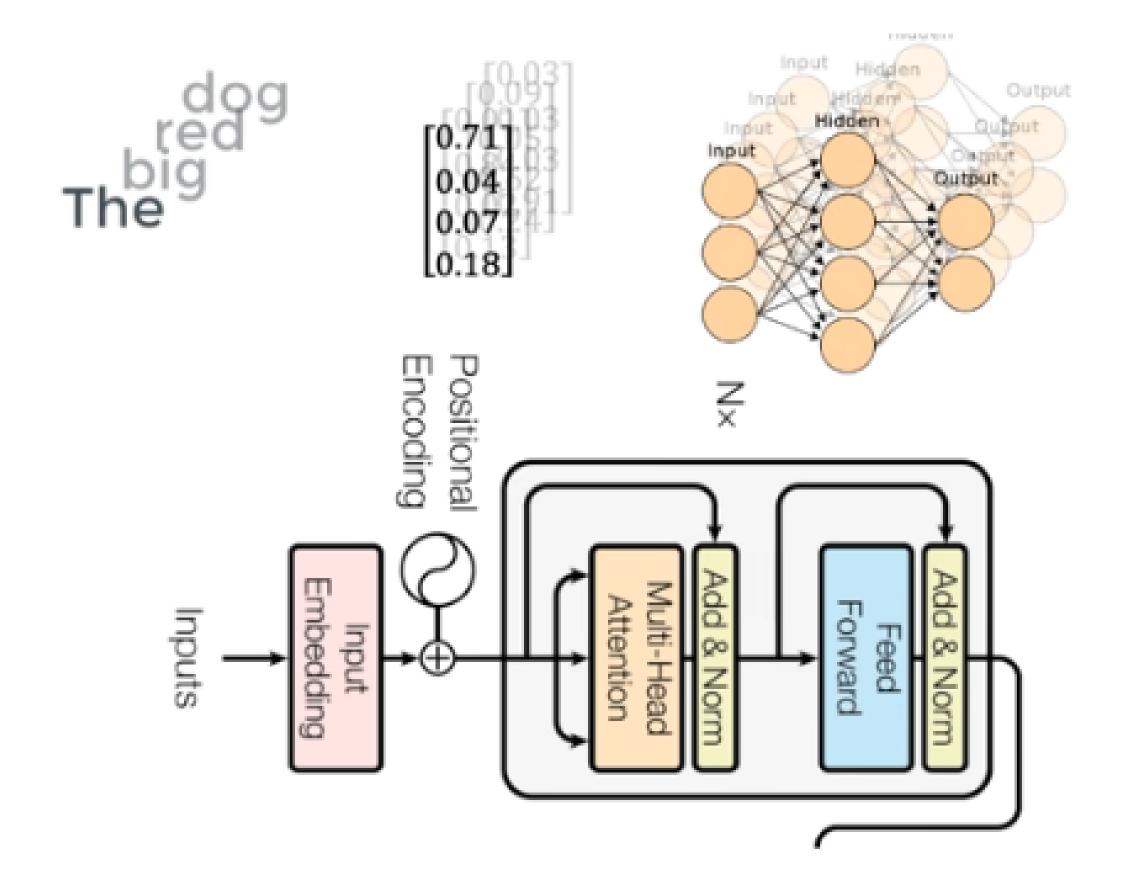


TRANSFORMERS





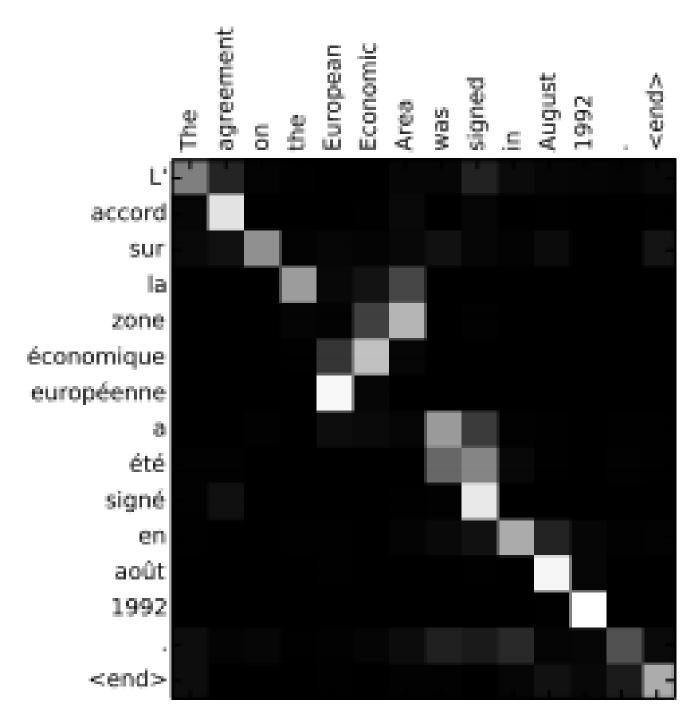
ENCODER



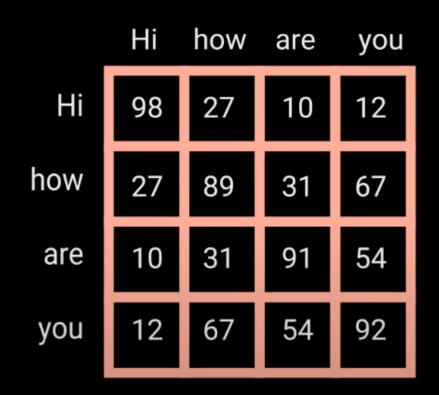
ATTENTION

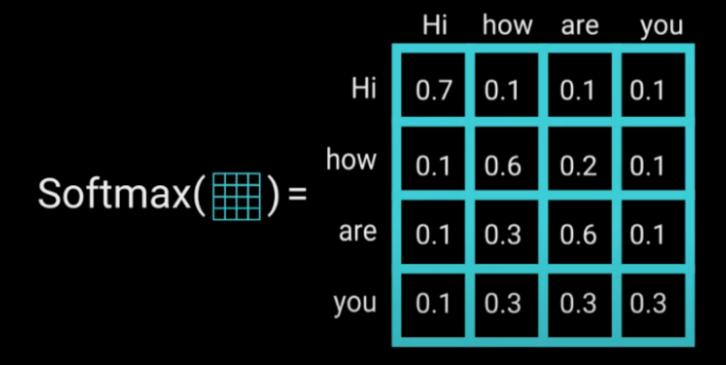
ATTENTION TAKES TWO SENTENCES,
TURNS THEM INTO A MATRIX WHERE
THE WORDS OF ONE SENTENCE FORM
THE COLUMNS, AND THE WORDS OF
ANOTHER SENTENCE FORM THE ROWS,
AND THEN IT MAKES MATCHES,
IDENTIFYING RELEVANT CONTEXT.

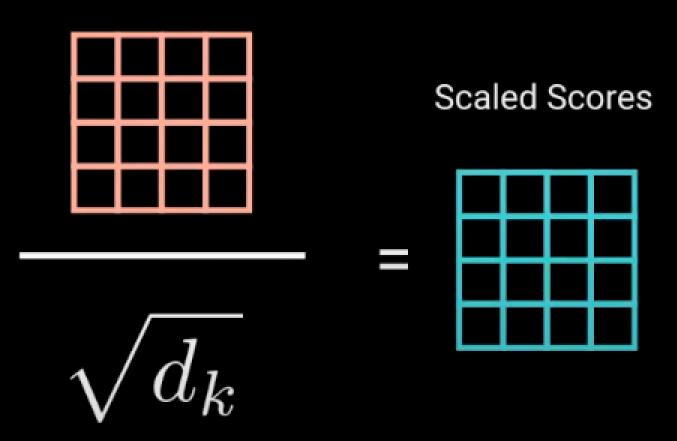
$$\mathbf{a}_{i}(\mathbf{e}_{i}^{(\mathbf{R})}, \mathbf{e}_{i}^{(\mathbf{S})}) = \operatorname{softmax}\left(\frac{\mathbf{e}_{i}^{(\mathbf{R})}\mathbf{e}_{i}^{(\mathbf{S})}}{\sqrt{d}}\right)\mathbf{e}_{i}^{(\mathbf{S})}$$
 (3)



SELF- ATTENTION



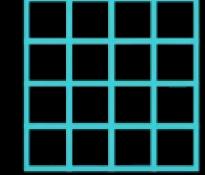




attention weights

value

output



X





OUTPUT EXAMPLE OF ER

EXAMPLE EMOTIONAL REACTION

RESPONSE:

I don't want you to jump. I don't want you to die, in either one. I don't know exactly what you're going through but from the sounds of it, I'd suggest focusing on the parts in your life that you enjoy.

LEVEL ON EMOTIONAL REACTION: 1

RATIONALE:

don't 1 want 1 you 1 to 1 jump. 1 T 1 don't 1 want 1 you 1 to 1 die, 1 in 1 either 1 one. 1

IGRACIAS!