IN SEARCH OF THE INVISIBLE

GPT in an Investigation of Hidden Semantic Information

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Presentation Agenda

- Introduction
- Theoretical Background
- Methods Overview
- Preliminary Findings
- Key Implications

Introduction

Artificial Intelligence in Natural Language Processing

- The Role of Artificial Intelligence (AI) in Language Processing
 - Fluency of Large Language Models (LLMs) in language comprehension
 - Revolution in Natural Language Processing (NLP) due to high proficiency in tasks such as translation and text generation
- LLMs in Action
 - Understand and generate text across languages
 - Handle complex linguistic information

Introduction

Existing Literature

Research Gap

- Neural Machine Translation (MT) Models versus Generative Pre-trained (GPT) 40
 - GPT models showcasing advancements in fluency and comprehension
 - Challenges observed in earlier neural machine translation (MT) models (Koehn & Knowles, 2017; Wan et al., 2022)
 - Issues in text-generation models (Wang et al., 2023)
 - Recent advancements in NLP (Perak et al., 2024; Riemenschneider & Frank, 2023) and human-like translation strategies (He et al., 2024)

Challenges and Opportunities

- While LLMs like GPT-40 exhibit impressive capabilities, challenges remain in capturing semantic nuances
- Exploring LLMs' performance in uncovering causal relationships

Theoretical Background

Cognitive Semantics and Force Dynamics

- Key Theoretical Framework: Utilised Leonard Talmy's (2000) schematic system of Force Dynamics to assess retention of cognitive information during translation
- Retention of Force Dynamics in Translation: Drawing on recent research (Wiśniewska, 2022 & 2023) that highlights how Force Dynamics is largely preserved during translation, even when there are significant linguistic differences
 - How is the meaning of physical or mental force in verbal expressions describing motion or action constructed, conveyed and understood across languages?

Theoretical Background

Cognitive Structure of Force Dynamics

The **ball kept rolling** down the hill.

Agonist: The ball (the entity that is actively rolling and trying to overcome resistance)

Antagonist: In this sentence, an unknown force (such as friction or an obstacle) that resists the ball's motion.

The **ball kept rolling** down the hill (despite the tall **grass**).

Action: Indicates the ongoing effort of the ball to move despie resistance.

Theoretical Background

Force Dynamics in Translation

Agonist Antagonist The river ice gave way to flowing water. **English:** Agonist Antagonist Joen jäät väistyivät virtaavan veden tieltä. **Finnish:** The river's ice withdrew from the path of the flowing water. **Polish:** Skute lodem rzeki rozmarzły i znów płynęła w nich woda. The frozen rivers thawed and water flowed in them again.

Methods Overview

Material Selection

GPT System Prompt

INPUT MATERIAL:

to English sentences (novel/film dialogue)

Original translations of the sentences (translated novel/subtitles) into Finnish and Polish

Translations of the sentences into Croatian prepared by the research team

Croatian, **Finnish**, and **Polish**

SYSTEM PROMPT:

✓ You are an **expert linguist** and **translator**.

✓ You **know how** to evaluate translations.

Methods Overview

GPT Instruction Prompt

INSTRUCTION PROMPT:

Provide a translation of a given sentence from English to Croatian/Finnish/Polish.

Describe your translation, as well as the **Google Translate** reference and the **human reference** provided, with an exclusive focus on their **verb phrases**.

Describe the verb phrases in terms of **lexis**, **syntax**, and **semantics**, and evaluate the quality of the translations of these **verb phrases**.

■When describing the semantics of the verb phrases, consider **Talmy's notion of Force Dynamics**.

The description of the verb phrase should be **qualitative**, and the evaluation of the verb phrase should be **numerical** as a float from **o to 1**.

GPT Qualitative Analysis

versus

Human Judgement



Translations from English into Finnish

10 December 2024

Examples

(1) English: He let the greatcoat fall on the ground. Agonist: greatcoat Antagonist: he

Finnish (GPT): Hän antoi päällystakin <u>pudota</u> maahan. [He <u>let</u> the coat <u>fall</u> to the ground.]

Semantically, it conveys the same Force Dynamics as the original, where 'he' allows the coat to fall without direct force. **GPT = human**

(2) English: I suppose we should start by reading it. Agonist: we Antagonist: Ø

Polish (Google Translate): Sądzę, że <u>powinniśmy zacząć</u> od przeczytania tego. [I think we <u>should start</u> from reading it.]

Semantically, the phrase conveys a sense of obligation and initiatin of an action. According to Talmy's Force Dynamics, 'powinniśmy' implies a social force compelling the action. **GPT ≈ human**

(3) English: Being at odds with her father about anything at all <u>made</u> her <u>uncomfortable</u>. Agonist: her Antagonist: being at odds

Croatian (Human Reference): Bilo joj je neugodno to što je bila u svađi s ocem oko bilo čega. [She was uncomfortable to be in an argument with her father about anything.]

Semantically, it conveys a state of being in disagreement, aligning with Talmy's Force Dynamics as it implies a static oppostion. **GPT ≠ human**

GPT Quantitative Measures

versus

Human Judgement



Examples

ENGLISH → FINNISH

GPT/Google Translate: Score: 0.95

Human Reference: Score: 0.6

$\mathsf{ENGLISH} \rightarrow \mathsf{POLISH}$

GPT: Score: 0.9

Google Translate: Score: 0.7

Human Reference: Score: 0.6

Perhaps I **should have written** Leon a story.

Ehkä minun olisi pitänyt kirjoittaa Leonille tarina. Perhaps I **should have written** a story for Leon.

Miksen kirjoittanut Leonille tarinaa? Why did I not write a story for Leon?

He let the greatcoat fall on the ground.

Pozwolił, aby płaszcz spadł na ziemię. He **let the coat fall** to the ground.

Upuścił płaszcz na ziemię. He **dropped (~let fall) his coat** on the ground.

Rzucił na ziemię szynel. He **threw his greatcoat** on the ground.

Key Implications

Broader Contribution

Contribution to AI-Assisted Translation Research:

- Exploring capabilities and limitations of LLMs in handling implied semantic information
- Examining interactions between **humans** and **AI**
- Core Insights:
 - Advancing our understanding of Translation Studies in the NLP-driven digital age
 - Emphasises the importance of **rigorous methodology** and **thoughtful evaluation metrics** (Alzahrani et al., 2024)

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Discussion and Q&A

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