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Appendix A Statistics of test sets in this paper

A comprehensive breakdown of the test data employed in the automated experimentation is delineated in Tables 7 and 8.

Appendix B Details on our human study

The set of 30 questions designated for the human study can be found in Table 9.

The distribution of individual scores, their mean and standard deviation on each question can be found in Fig. 12.

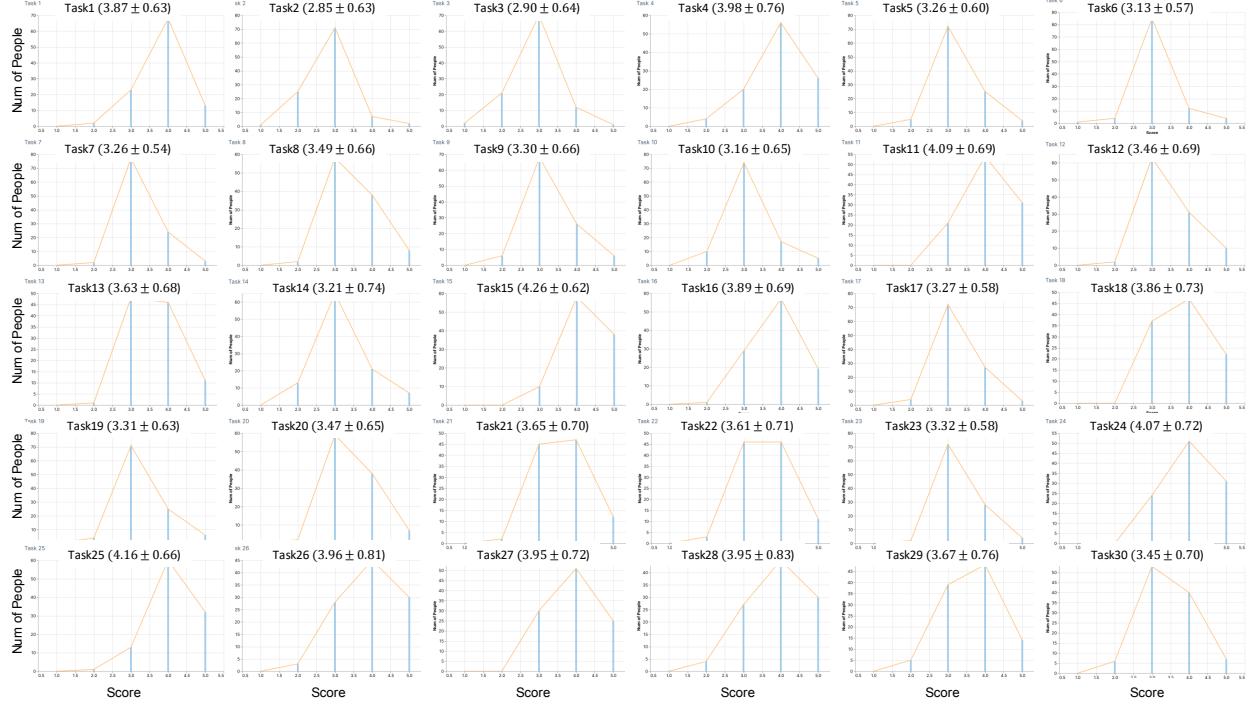


Figure 12: The distribution of individual scores, their mean and standard deviation on each question.

Appendix C Case Study

We present case studies in this section to show the advantage of our EmotionPrompt over the original prompts in generative experiments using GPT-4.

- Table 10: Case study on environmental science.
- Table 11 and Table 12: Case studies on intimate relationship.
- Table 13: Case study on social science.
- Table 14: Case study on law.
- Table 15: Case study on barrier free.
- Table 16 and Table 17: Case studies on poem writing.
- Table 18: Case study on summarization task.
- Table 19 and Table 20: Two failure cases.

Table 7: Detailed description of 24 instruction induction tasks proposed in [13].

Category	Task	Original Prompt	Demonstration
Spelling	First Letter (100 samples)	Extract the first letter of the input word.	cat → c
	Second Letter (100 samples)	Extract the second letter of the input word.	cat → a
	List Letters (100 samples)	Break the input word into letters, separated by spaces.	cat → c a t
	Starting With (100 samples)	Extract the words starting with a given letter from the input sentence.	The man whose car I hit last week sued me. [m] → man, me
Morphosyntax	Pluralization (100 samples)	Convert the input word to its plural form.	cat → cats
	Passivization (100 samples)	Write the input sentence in passive form.	The artist introduced the scientist. → The scientist was introduced by the artist.
Syntax	Negation (100 samples)	Negate the input sentence.	Time is finite → Time is not finite.
Lexical Semantics	Antonyms (100 samples)	Write a word that means the opposite of the input word.	won → lost
	Synonyms (100 samples)	Write a word with a similar meaning to the input word.	alleged → supposed
	Membership (100 samples)	Write all the animals that appear in the given list.	cat, helicopter, cook, whale, frog, lion → frog, cat, lion, whale
Phonetics	Rhymes (100 samples)	Write a word that rhymes with the input word.	sing → ring
Knowledge	Larger Animal (100 samples)	Write the larger of the two given animals.	koala, snail → koala
Semantics	Cause Selection (25 samples)	Find which of the two given cause and effect sentences is the cause.	Sentence 1: The soda went flat. Sentence 2: The bottle was left open. → The bottle was left open.
	Common Concept (16 samples)	Find a common characteristic for the given objects.	guitars, pendulums, neutrinos → involve oscillations.
Style	Formality (15 samples)	Rephrase the sentence in formal language.	Please call once you get there → Please call upon your arrival.
Numerical	Sum (100 samples)	Sum the two given numbers.	22 10 → 32
	Difference (100 samples)	Subtract the second number from the first.	32 22 → 10
	Number to Word	Write the number in English	26 → twenty-six