

## Acknowledgments

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## Ethics Statement

The significance of knowledge editing lies in its direct impact on the behavior and output results of LMs. Malicious edits may lead to the generation of responses with toxicity or bias in LMs, posing potential harm to users and society. Therefore,

when applying knowledge editing techniques or utilizing this system, careful consideration must be given to potential risks and ethical concerns. All our data undergoes meticulous manual inspection, and any malicious edits or offensive content have been removed.

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