Robots in the Middle: Evaluating LLMs in Dispute Resolution

Jinzhe Tan, Hannes Westermann, Nikhil Reddy Pottanigari, Jaromír Šavelka, Sébastien Meeùs, Mia Godet and Karim Benyekhlef





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1

Introductions





Background

Disputed parties may:

- Be overwhelmed by <u>emotions</u>.
- Struggle with <u>complex</u> situations.
- Misunderstand or confuse each other.
- Reach a <u>deadlock</u>.
- Argue without clear <u>evidence</u>.
- Intermediaries, such as mediators, arbitrators, or conciliators, can:
 - Calm tensions.
 - Clarify misunderstandings.
 - Identify key issues.
 - Propose solutions.





Challenges

- Restricted Accessibility
 - The mediation has to be worth it
- Resource Constraints
 - Lack of trained mediators (Branting et al., 2023)
- Technological solutions?
 - Game-theoretic methods (Bellucci et al., 2001)
 - Computational methods (Larson, 2010, Branting et al. 2023)
 - O ...





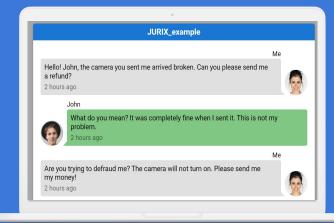
Proposed Framework





LLMediator Framework

- F1 - Reformulating inflammatory messages
- F2 Drafting messages for the mediator
- F3 Autonomously intervening in the negotiation?



Westermann, H., Savelka, J. and Benyekhlef, K., 2023. LLMediator: GPT-4 Assisted Online Dispute Resolution.

Evaluation

- Blind comparison with human mediators
 - Hard to maintain a structured message format
 - Hard to introduce the requirement within the prompt
- Two step evaluation approach
 - S1 Decide intervention types
 - S2 Draft intervention message





Experiment Design





Drafting Disputes scenarios

Charac.	Explanation	Examples
Emotional	The parties have strong emotional expressions in the conversation.	A person asks their neighbour to keep their dogs quiet, resulting in an escalating conversation with threats.
Complex	The dispute has a high degree of complexity and the facts of what happened are difficult to clarify.	A person asks an insurance company to pay for a car accident, resulting in a discussion of legal and technical nuances.
Confusion	The parties are confused, leading to difficulties in communication.	A customer and merchant disagree on the details of an undelivered order, leading to repeated requests for more information.
Impossible	The dispute features strong disagreements, resulting in a deadlock.	A customer requests a laptop to be repaired, but the manufacturer argues that the damage is caused by the user, refusing the warranty.
Evidential	The dispute centers around conflicting evidence or claims.	One party insists that an agreement regarding a computer sale was reached, while the other disagrees.

50 Disputes scenarios

Sender	Messages
Α	Hi, I received the package I ordered from your store, but the item is damaged. I'd like to request a refund or a replacement.
В	We're sorry to hear that. However, our policy states that damage incurred during shipping is the responsibility of the courier service, not ours.
Α	But as a customer, my transaction is with your store, not the courier. It's so ironic that you have this kind of service attitude, it's unacceptable. I am not only going to file a complaint with the Consumer Protection Service, but I am also going to write a bad review so that everyone will know what kind of business you are!
В	That's unfortunate. We understand your frustration, but we can only offer a discount on your next purchase. We can't control what happens during shipping.





S1 - Intervention types

No.	Intervention Types	
1	Encourage exchanges of information	
2	Help the parties understand each other's views	
3	Let the parties know that their concerns are understood	
4	Promote a productive level of emotional expression	
5	Lay out the differences in perceptions and interests	
6	Identify and narrow issues	
7	Help parties realistically evaluate alternatives to settlement	
8	Suggest that the parties take breaks when negotiations reach an impasse	
9	Encourage flexibility and creativity	
10	Shift the focus from past to future	
11	Shift the focus from one of blame to a creative exchange between the parties	
12	Hold caucuses with each disputant if there is deadlock or a problem	
13	Propose solutions that meet the fundamental interests of all parties	





S2 - Intervention message

Dispute summary	Intervention types chosen	Interventions messages
Party A asks Party B to delete their picture from social media. B refuses and makes fun of A.	Human: 4. Promote a productive level of emotional expression, 13. Propose solutions that meet the fundamental interests of all parties. (preferred)	Human: Let's not insult each other or downplay one's feelings. B, you must delete the picture, since keeping it without A's consent is illegal.
	LLM: 2. Help the parties understand each other's views, 3. Let the parties know that their concerns are understood, 9. Encourage flexibility and creativity	LLM: Let's ensure the conversation is respectful. Here's a proposition: Part B, how about posting an image that both of you find humorous and enjoyable instead? This way, Party A won't feel embarrassed and both of you can have fun. (preferred)

4

Results





Key results

• E1 - Intervention type

 62% of LLMs chosen types rated equal to or better than human messages.

E2 - Intervention message

 84% of LLM-generated messages rated equal to or better than human messages.





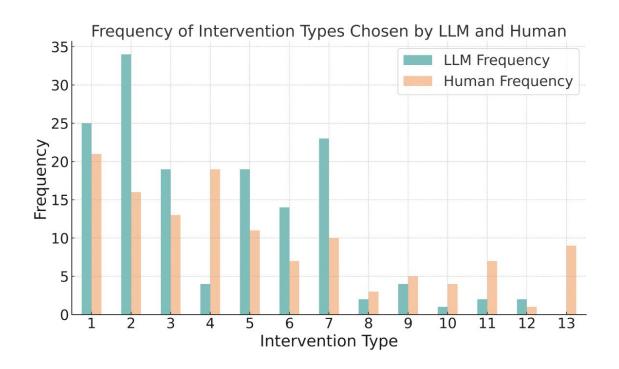
E1 - Intervention types

Description	Number of responses
LLM is significantly better than Human	11
LLM is slightly better than Human	11
LLM and human are about the same	9
Human is slightly better than LLM	14
Human is significantly better than LLM	5





E1 - Intervention types

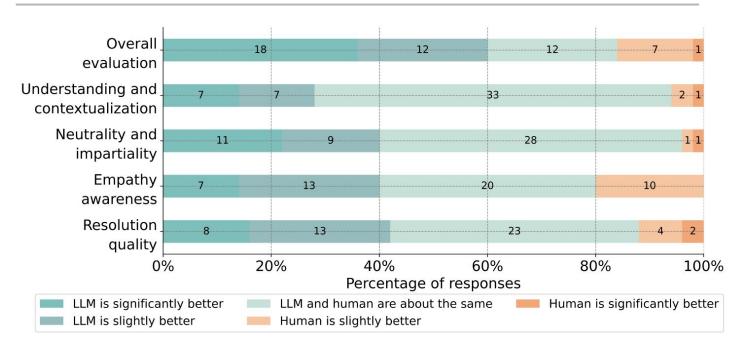


Pezeshkpour, P., Hruschka, E.: Large language models sensitivity to the order of options in multiplechoice questions (2023), https://arxiv.org/abs/2308.11483





E2 - Intervention messages







Discussion





Takeaways

- LLMs provide clarity, consistent tone, provide more acceptable solutions.
- Humans more often misunderstood the dispute.
- LLMs have better performance in choosing intervention types and drafting messages.
- Assumption of humans as gold standard is facing challenges.





Limitations

- Experimental setup differs from real-world mediation contexts.
- Annotators and evaluators have legal background but are not expert in mediation.
- Hard to tell which intervention is "better" objectively.





Q&A

Any questions?



