A Conversational Agent for Argument-driven E-participation

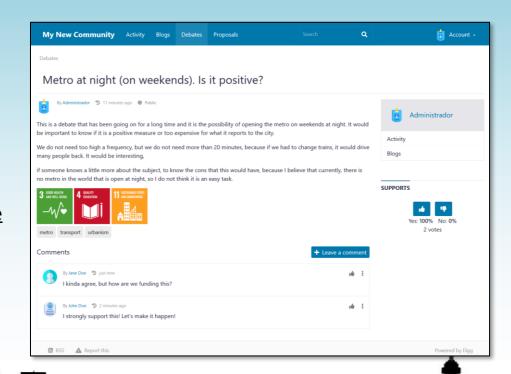
Andrés Segura-Tinoco¹, Andrés Holgado-Sánchez¹, <u>Iván Cantador</u>¹, María E. Cortés-Cediel², Manuel Pedro Rodríguez Bolívar³



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E-participation

- E-participation understood as the computer-assisted support to citizen collaboration – has originated novel consultation and deliberation processes
- Most current e-participation platforms are based on web forums
 - Citizens make proposals and provide comments and opinions, forming <u>large</u> conversation threads
- Recent attention has shifted to social media, especially social networks –e.g., Facebook and Twitter– and instant messaging tools, such as Telegram and WhatsApp



E-participation platforms

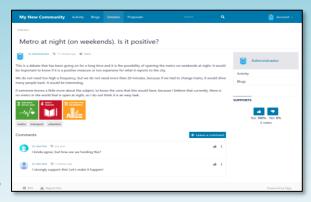
Conventional web forums promote social interaction

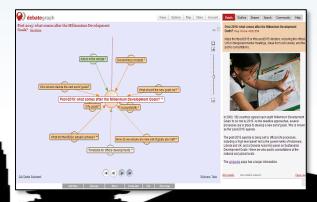
Pros

- Easy and fast content generation (through free text posts)
- Smooth, large-scale interaction (via comment threads)

Cons

- No or very limited functionalities for content organization, filtering and analysis
- Challenging moderation and processing of debate results
- Dispersed and redundant content, since it is structured by *time*
- Argument-driven tools promote the <u>production and reuse of collective knowledge</u>





Motivation and goal

- Our work on e-participation...
 - addresses two promising research lines
 - The use of **conversational agents** or chatbots as citizen-to-government communication channels in instant messaging applications
 - The exploitation of argument mining techniques to automatically extract and present argumentative information from citizen-generated content

targets a final goal

 Helping on finding out and understanding city problems and citizens' concerns, and consequently on getting well-formed opinions for making better decisions in participatory processes



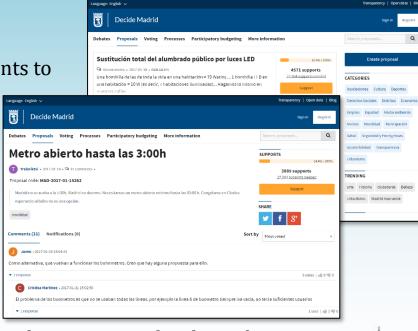
Case study

The 'Decide Madrid' e-participation platform

 A web system designed to allow Madrid residents to make, debate and vote proposals for the city

- Available data for a citizen proposal
 - Title
 - Author, date
- Summary, description
 - Freely-chosen tags
- User comment threads
- Heterogeneous topics and debates

 Urbanism, transport, environment, health care, education, social rights, education, culture, economy, job, politics, security, housing, family, old age, religion, animals, etc.



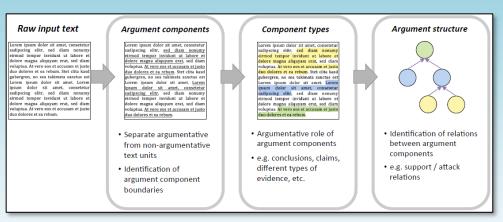
Argument mining

Tasks

- Detection of argument text fragments
- Identification of argument components
- Extraction of argument relations

Algorithmic foundations

- Natural Language Processing (NLP)
- Machine/deep learning



Source: ACL'16 tutorial "NLP Approaches to Computational Argumentation"

Linguistic features

• **Sentence-level features**, e.g., sentence length, constituency tree depth, argument linkers, etc.

• **Grammatical word categories**, e.g., number of nouns, modal verbs, etc.

• Syntactic patterns

Argument extraction method (I)

- Argument model
 - Premise → Claim → Major claim
- Types and subtypes of argument relations
 - Cause: linking an argument that reflects the <u>reason</u> or <u>condition</u> for another argument
 - Clarification: introducing a <u>conclusion</u>, <u>exemplification</u>, <u>restatement</u> or <u>summary</u> of an argument
 - **Consequence**: evidencing an <u>explanation</u>, <u>goal</u> or <u>result</u> of a previous argument
 - Contrast: attacking arguments, distinguishing between giving <u>alternatives</u>, doing <u>comparisons</u>, making <u>concessions</u>, and providing <u>oppositions</u>
 - **Elaboration**: introducing an argument that provides details about another one, entailing <u>addition</u>, <u>precision</u> or <u>similarity</u> issues about the target argument

Argument extraction method (II)

Example of an extracted argument tree

```
Root argument [depth level 0]:
MC: Massive tree planting in Madrid.
- Argument reply [depth level 1]:
  C: Planting trees native to the Madrid region.
  L: {linker: 'to', intent: 'support', type: 'CONSEQUENCE', subType: 'GOAL'}
  P: Improve air quality, maintain a natural lifestyle and improve urban aesthetics with living beings.
  - Argument reply [depth level 2]:
    C: The first thing they should do is to stop cutting down healthy trees.
    L: {linker: 'as', intent: 'support', type: 'CAUSE', subType: 'REASON'}
    P: They are doing in Manzanares neighborhood.
  - Argument reply [depth level 2]:
    C: More than 230 trees in 3 weeks with the excuse that they are very dangerous and will fall on us.
    L: {linker: 'but', intent: 'attack', type: 'CONTRAST', subType: 'OPPOSITION'}
    P: When they started cutting down, only 4 of the 230 were hollow inside.
  - Argument reply [depth level 2]:
    C: Then they talk to us about contamination.
    L: {linker: 'but', intent: 'attack', type: 'CONTRAST', subType: 'OPPOSITION'}
    P: It is a lie, an incongruity and a nonsense.
    - Argument reply [depth level 3]:
      C: If only the trees they cut down were replaced by younger ones.
      L: {linker: 'but', intent: 'attack', type: 'CONTRAST', subType: 'OPPOSITION'}
      P: That is not the case.
      - Argument reply [depth level 4]:
        C: When an old tree falls on people it is a catastrophe.
        L: {linker: 'but', intent: 'attack', type: 'CONTRAST', subType: 'OPPOSITION'}
        P: We know that for years the care of the trees has not been controlled.
```



Chatbot interaction

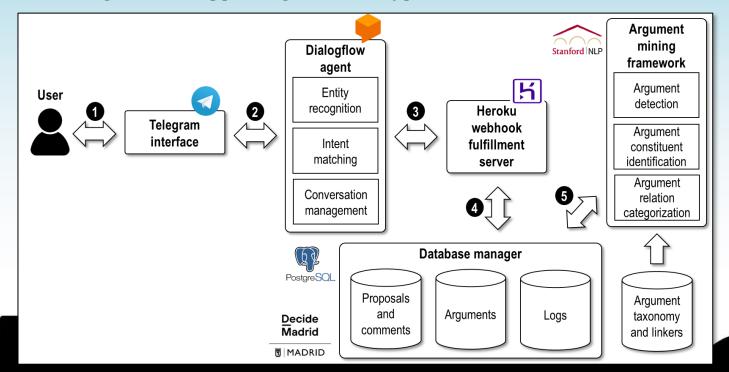
- Through a natural language conversation with the chatbot, the user:
 - explores citizen proposals and comments, organized by categories, topics and districts
 - 2. accesses to categorized citizens' **arguments** given in the debates around a proposal
 - 3. provides **feedback** and **votes** for proposals





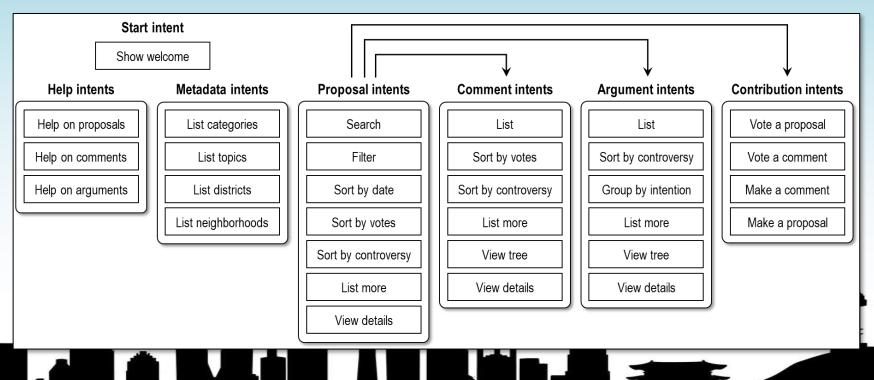
Chatbot architecture

• The chatbot is built upon the **Google DialogFlow** framework, which links external web services with a variety of **instant messaging and social networking services**, e.g., Google Assistant, Facebook Messenger, WhatsApp, Telegram and Skype



Chatbot conversation flow

 The chatbot handles several conversation intents, each of them with triggering sentence patterns and associated functionalities



User study

- Empirical evaluation of the chatbot in terms of:
 - 1. The feasibility of exploring e-participation content via a <u>conversational interface</u> (in mobile devices)
 - 2. The potential benefits of <u>argument-driven information</u> in e-participation

- Uncontrolled, realistic scenario
 - Without external supervision, participants <u>freely tested</u> the chatbot via <u>Telegram</u> during a period of <u>one week</u>, using their own Telegram accounts and mobile devices
- 32 participants → 2 groups
 - Control group: having <u>disabled</u> the chatbot's argument-driven browsing functionalities
 - Experimental group: having enabled the chatbot's argument-driven browsing functionalities

Evaluation

- Objective metrics → effectiveness, efficiency
 - Avg. number of sessions per participant
 - Avg. duration of session
 - Avg. number of actions per participant
- Subjective questionnaires → citizen participation, decision making, public service values
 - A questionnaire with 33 five-point Likert scale items addressing 10 evaluation criteria
 - Effectiveness, efficiency
 - Ease of use, usability
 - Usefulness, satisfaction, engagement
 - Transparency, fairness, persuasiveness

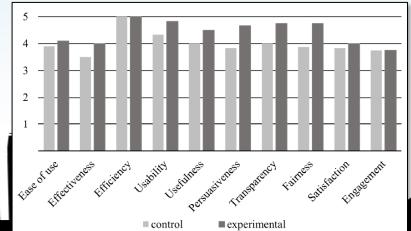


Results (detailed in the paper)

Objective metrics

	control group	experimental group
avg. number of sessions per user	2.8	2.8
avg. duration of session (in minutes)	16.0	23.3
avg. number of actions per user	56.8	64.9
ask for help	13.5	10.8
list categories/topics/districts/neighborhoods	6.4	7.2
filter proposals	8.0	15.6
sort proposals	2.7	2.1
explore proposals	11.3	9.8
explore comments	7.6	6.7
explore arguments	-	7.4
provide feedback (new vote/comment/proposal)	1.7	2.1

Subjective questionnaires





Main findings

More user activity

- No significant difference on the avg. number of sessions per user (between groups)
- Longer sessions in the control group
 - Increase of **45.6%** on the avg. session duration (from 16.0 to 23.3 minutes)

Higher user persuasiveness and engagement

- Increase of **14.3%** (from 56.8 to 64.9) on the avg. number of actions per user
- Increase of 23.5% (from 1.7 to 2.1) on the avg. number of feedback actions per user
- Meaningful exploration of <u>arguments</u> (avg. 7.4 actions per user)

Better user opinions

- About the chatbot: highly efficient, quite effective, moderately easy to use
- About the **argumentative information**: higher perception of transparency and fairness

(Some) Open issues

Participants' suggestions

- A more "natural" conversation with the chatbot
- A more fluent transition between browsed proposals
- Facilities to read proposals with large descriptions

Future research directions

- Personalized recommendation mechanisms to proactively present relevant content to the user, thus mitigating the information overload problem
- Richer data structures, analysis and visualizations for facilitating decision making
- Functionalities oriented to citizen collaboration

Integration of external data sources, such as open government data and news items

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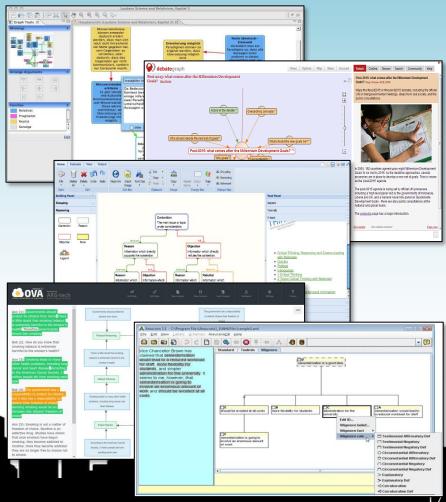
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Argument mining

- **Tools**
 - **Collaborative editors of argumentative** graphs
 - Agora, http://agora.gatech.edu
 - Argunet, http://www.argunet.org
 - DebateGraph, http://debategraph.org
 - Rationale Online, https://www.rationaleonline.com
- **Argumentative annotation platforms**
 - Araucaria, http://araucaria.arg.tech
 - OVA, http://ova.arg-tech.org



Argument extraction method

Argument linkers

Cause Reason support 16 because [of], due to, since 16 porque, ya que, debido a [que], pues Conclusion support 18 to conclude, in/as conclusion Exemplification support 18 support 19 for, to, in order to, aimed/aiming to Result support 21 therefore, thus, hence, then, so [that] Consequence Contrast Comparison Support 46 Support 46 Support 47 Alternative Support 46 Support 46 Support 46 Support 47 Contrast Concession attack 16 although, [even] though, despite [that] 28 Addition Support 15 also, besides, as well, too, moreover 17 también, además/aparte [de], [lo que] es Condition qualifier 30 if [ever/so], in case of/that 33 si [alguna vez/es asi], en caso de/que porque, ya que, debido a [que], pues 49 Conclusion support 18 to conclude, in/as conclusion 21 para concluir, en/como conclusión 21 por ejemplo, como ejemplo [de] 22 en otras palabras, es decir, esto es resumiendo, concluyendo, para acabar 44 Contrast Concession attack 16 although, [even] though, despite [that] 28 aunque, aún/incluso [si/así], a pesar de por (si embargo, no obstante 102 Addition support 15 also, besides, as well, too, moreover 17 también, además/aparte [de], [lo que] es Contrast Concession support 15 also, besides, as well, too, moreover 17 también, además/aparte [de], [lo que] es Contrast Concession support 15 also, besides, as well, too, moreover 17 también, además/aparte [de], [lo que] es Concession support 11 in particular, particularly, especially 13 en particular, particularmente, especialny	Туре	Subtype		English linkers			Spanish linkers	
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Study questionnaire

- 33 items
- 10 evaluation criteria
 - Citizen participation
 - Decision making
 - Public values

Criterion	Questionnaire item
	I1: The chatbot is easy to use
	I2: The interaction with the chatbot does not require a lot of mental effort
Ease of use	I3: The help documentation of the chatbot is easy to understand
	I4: The help documentation of the chatbot is complete
	I5: The help documentation of the chatbot is valuable
	I6: The chatbot understands the user's questions and commands
Effectiveness	I7: The chatbot gives correct responses to the user's requests
	I8: The chatbot is ready to interact soon after invocation
Efficiency	I9: The chatbot provides responses quickly
	I10: The chatbot allows exploring the citizen proposals about certain topic
Usability	I11: The chatbot allows exploring the content of a citizen proposal
	I12: The chatbot allows exploring the pros and cons of a citizen proposal
	I13: The chatbot allows finding out the city problems and citizens' concerns
Usefulness	I14: The chatbot allows understanding others' ideas and opinions about citizen proposals
,	I15: The chatbot allows getting well-formed opinions and making better decisions in the participatory process
	I16: The chatbot promotes rethinking initial opinions about citizen proposals
Persuasiveness	I17: The chatbot promotes commenting on citizen proposals
	I18: The chatbot promotes making own proposals for the city
	I19: The chatbot allows exploring a representative sample of citizen proposals
Transparency	I20: The chatbot allows exploring a representative sample of citizen comments and opinions in the citizen debates
	I21: The chatbot allows exploring an unbiased sample of citizen proposals
Fairness	I22: The chatbot allows exploring an unbiased sample of citizen comments (opinions) in the debates
	I23: The chatbot allows getting informed about controversial issues in the city
	I24: The chatbot allows getting informed about city issues affecting to minority or discriminated groups
Satisfaction	I25: I am satisfied with the functionalities provided by the chatbot
	I26: I am satisfied with the interaction (communication) offered by the chatbot
	I27: I am satisfied with the current version of the chatbot
	I28: I liked using the chatbot as a citizen participation tool
Engagement	I29: I enjoyed using the chatbot
	I30: I would use the chatbot again
	I31: I would recommend the chatbot to other people
	I32: I am going to enter into the Decide Madrid platform
	I33: I am going to search for information about (electronic) citizen participation initiatives



32 participants

- **Gender**: 22 male, 10 female
- **Ages**: 18-29 years old (12), 30-39 years old (9), 40-49 years old (5), 50-59 years old (4), more than 59 years old (2)
- **Education levels**: secondary education (3), vocational education (1), Bachelor's degree (20), Master's degree (6), Doctoral degree (2)
 - Those with Higher Education levels had studied Sciences (3), Social Sciences (10), Arts and Humanities (4), and Engineering (11) careers
- Diverse levels of **knowledge/expertise on chatbots** –null knowledge and expertise (5), null expertise (5), low expertise (20), medium expertise (2)
- Diverse levels of **knowledge on citizen participation** –null (7), low (16), medium (9)

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