

The Structure of Toxic Conversations on Twitter



Martin Saveski, Brandon Roy, Deb Roy—MIT

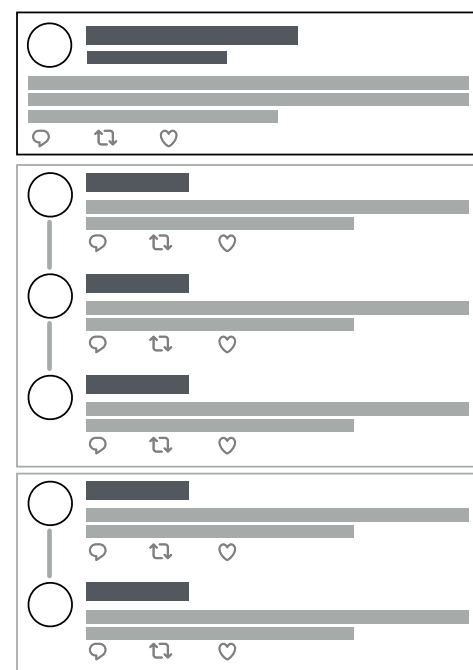
Goals

- Analysis: study the relationship between structure and toxicity of conversations, *after the conversations are over*
- Prediction: predict future toxicity based on the structure of the conversation, *as the conversation unfolds*

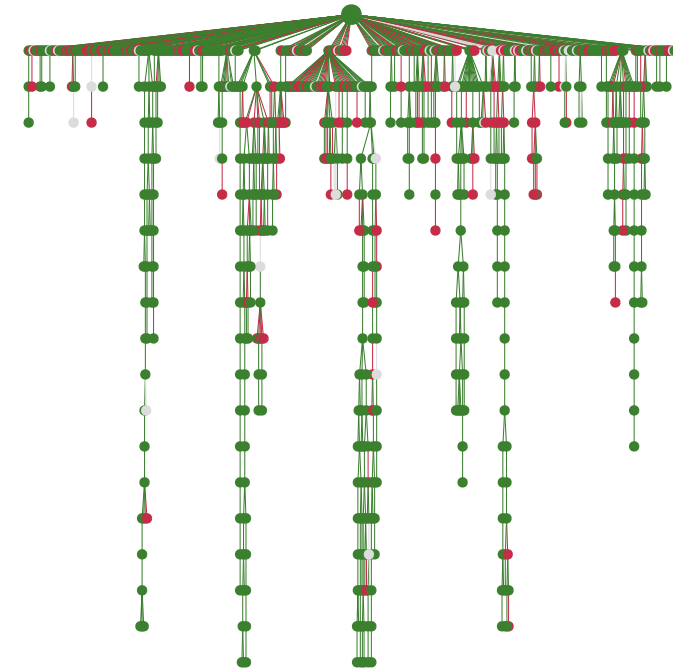
Data

- News: 510K+ conversations, 32M+ tweets, 5 outlets, 1 year
- Midterms: 676K+ conversations, 25M+ tweets, 1,430 candidates, 5 months

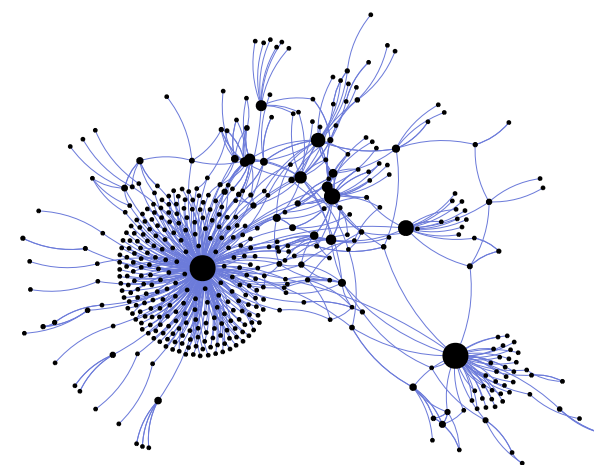
Representing a Twitter Conversation



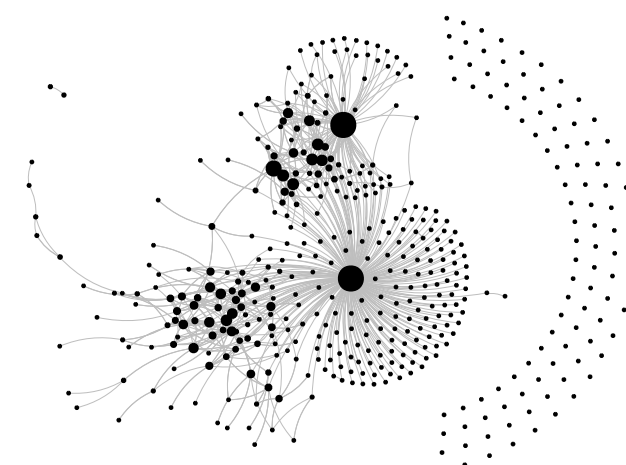
Twitter UI



Reply Tree



Reply Graph



Follow Graph

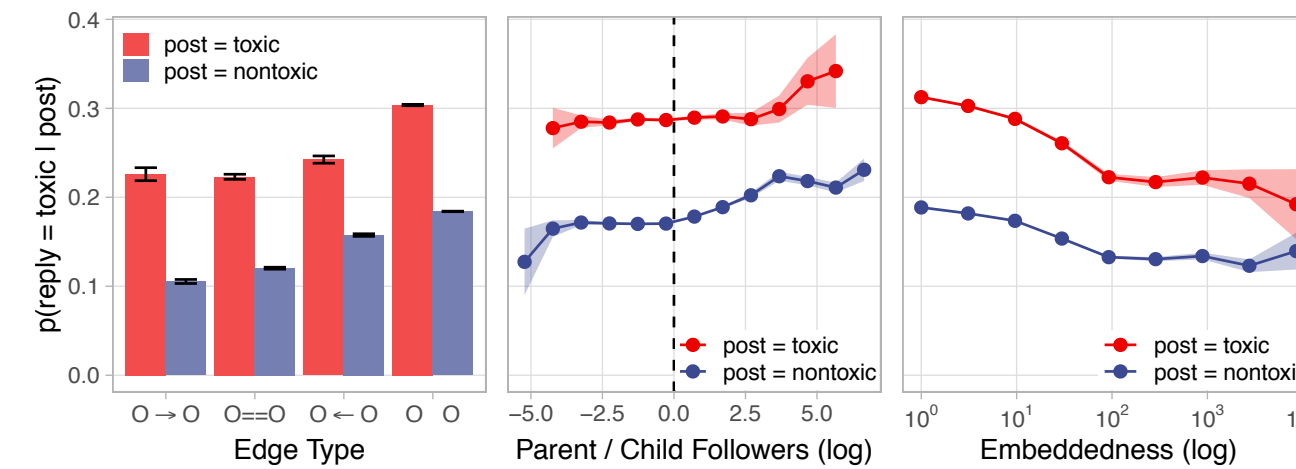
Analyses

Individual-level Analysis

- Toxicity is spread across many low to moderately toxic users

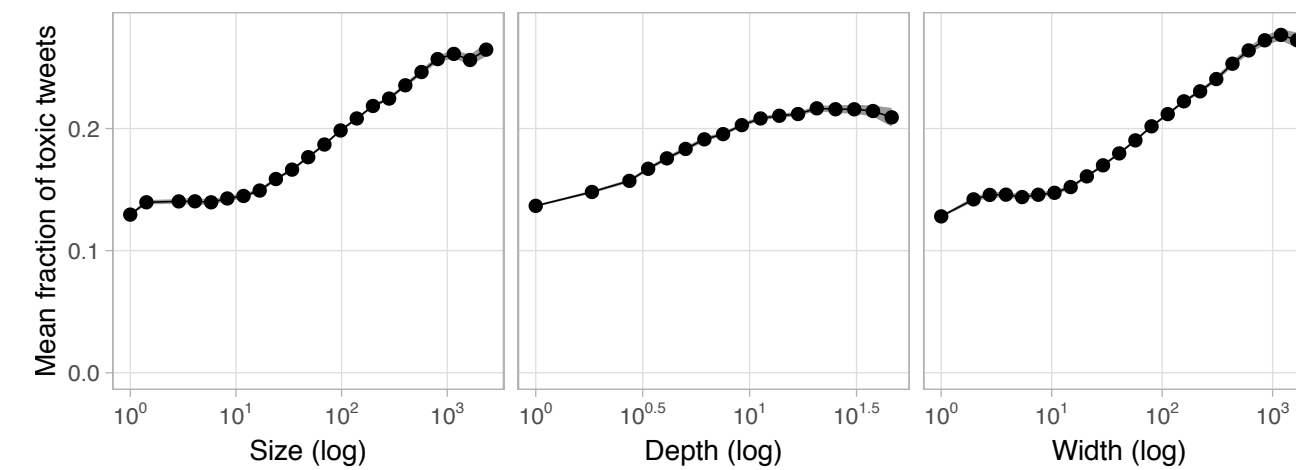
Dyad-level Analysis

- Toxic replies are more likely to come from other users who: (i) do not have any social relationship with the poster, (ii) have fewer followers, and (iii) do not have many common friends



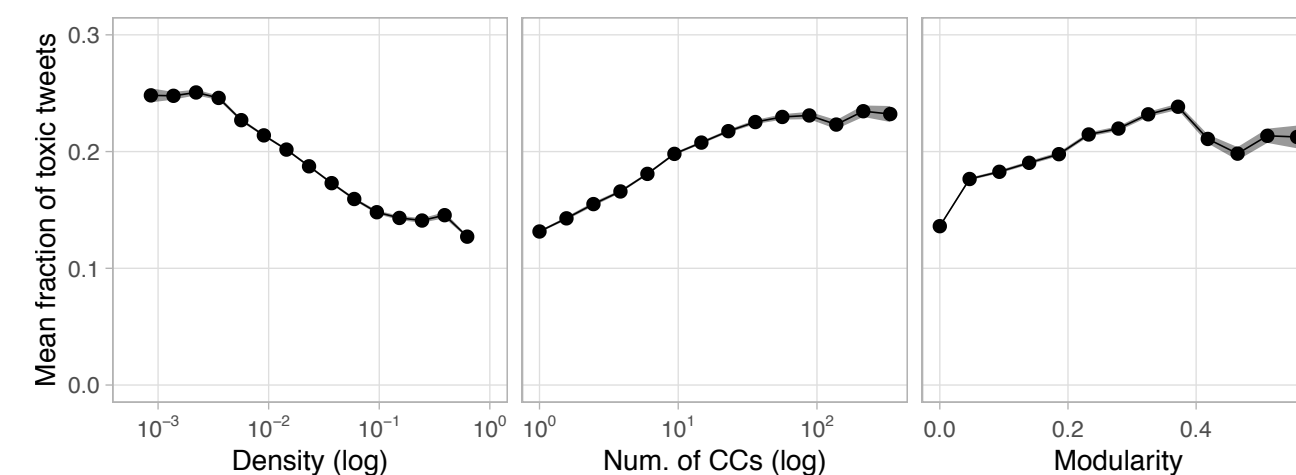
Reply Tree Structure

- Toxic conversations tend to have larger, deeper, and wider reply trees



Follow Graph Structure

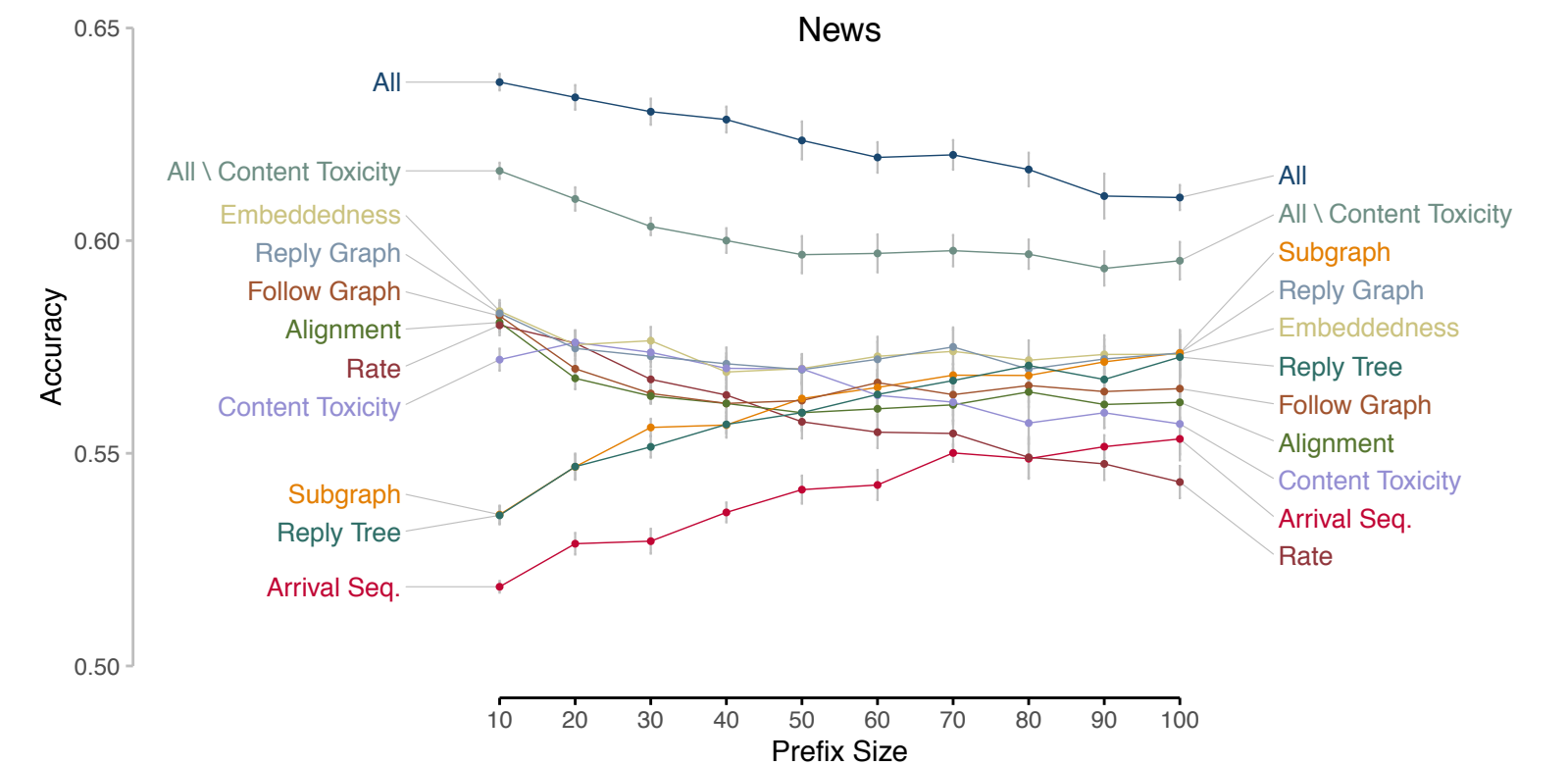
- Toxic conversations tend to have follow graphs that are denser, have more CCs, and higher modularity



Prediction

Future Toxicity Predictions

- Task: Given the conversation so far, predict whether the conversation will become more toxic than expected
- Using stratification to control for prefix toxicity



Next Reply Toxicity Predictions

- Task: User i is about to join the conversation, will they post a toxic reply?
- Paired prediction task to control for the root content

	ACC	AUC	F1
All	0.712	0.797	0.712
All \ Conversation State	0.680	0.753	0.679
Conversation State	0.676	0.757	0.675
User-Parent Dyad	0.633	0.690	0.630
Toxic Embeddedness	0.595	0.651	0.599
Reply Graph	0.571	0.602	0.574
User-Root Dyad	0.556	0.583	0.567
Reply Tree	0.530	0.544	0.531
Follow Graph	0.527	0.540	0.521
User Info	0.519	0.527	0.524
Overall Embeddedness	0.517	0.525	0.513
Political Alignment	0.510	0.517	0.573