

# A Motif-based Approach for Identifying Controversy

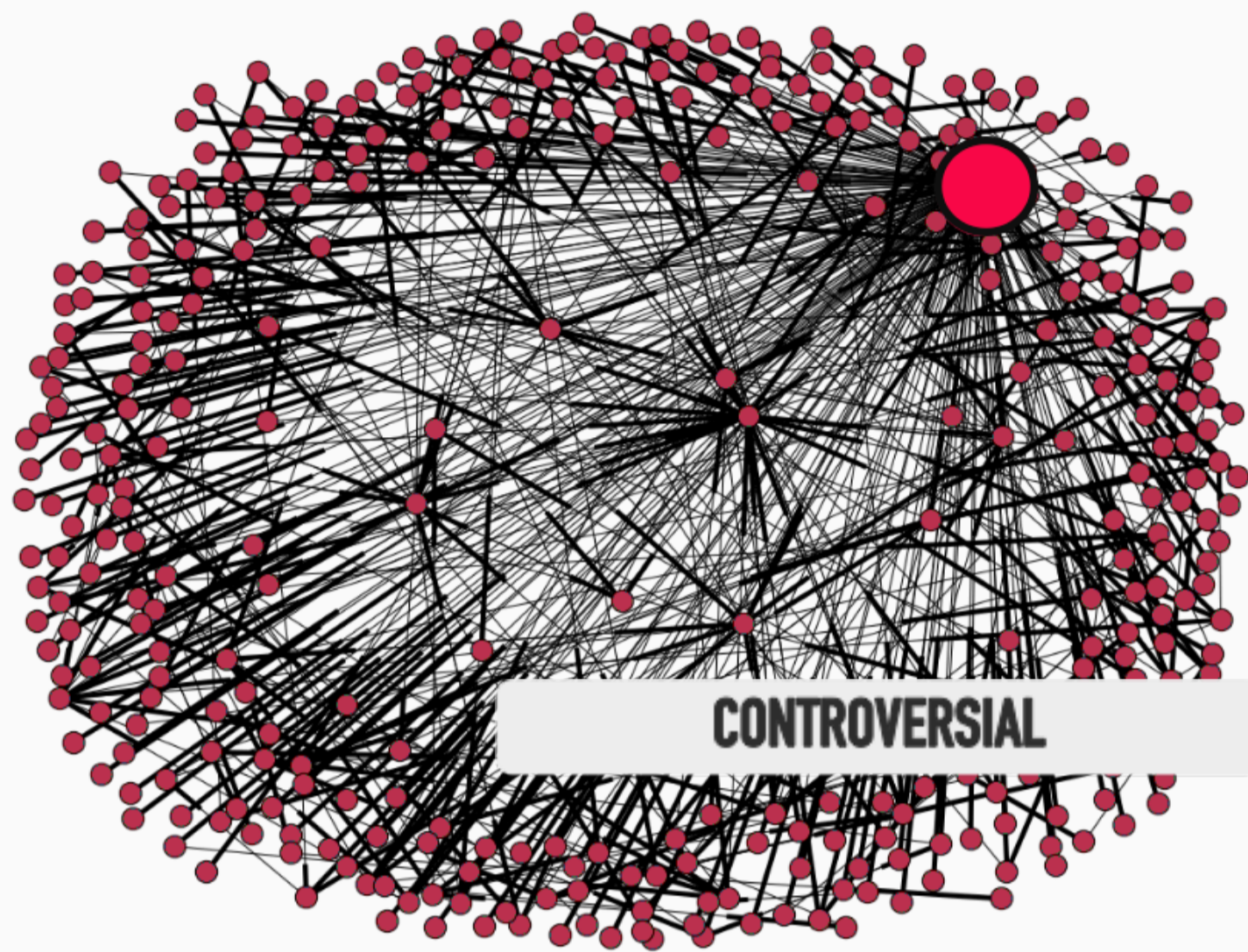
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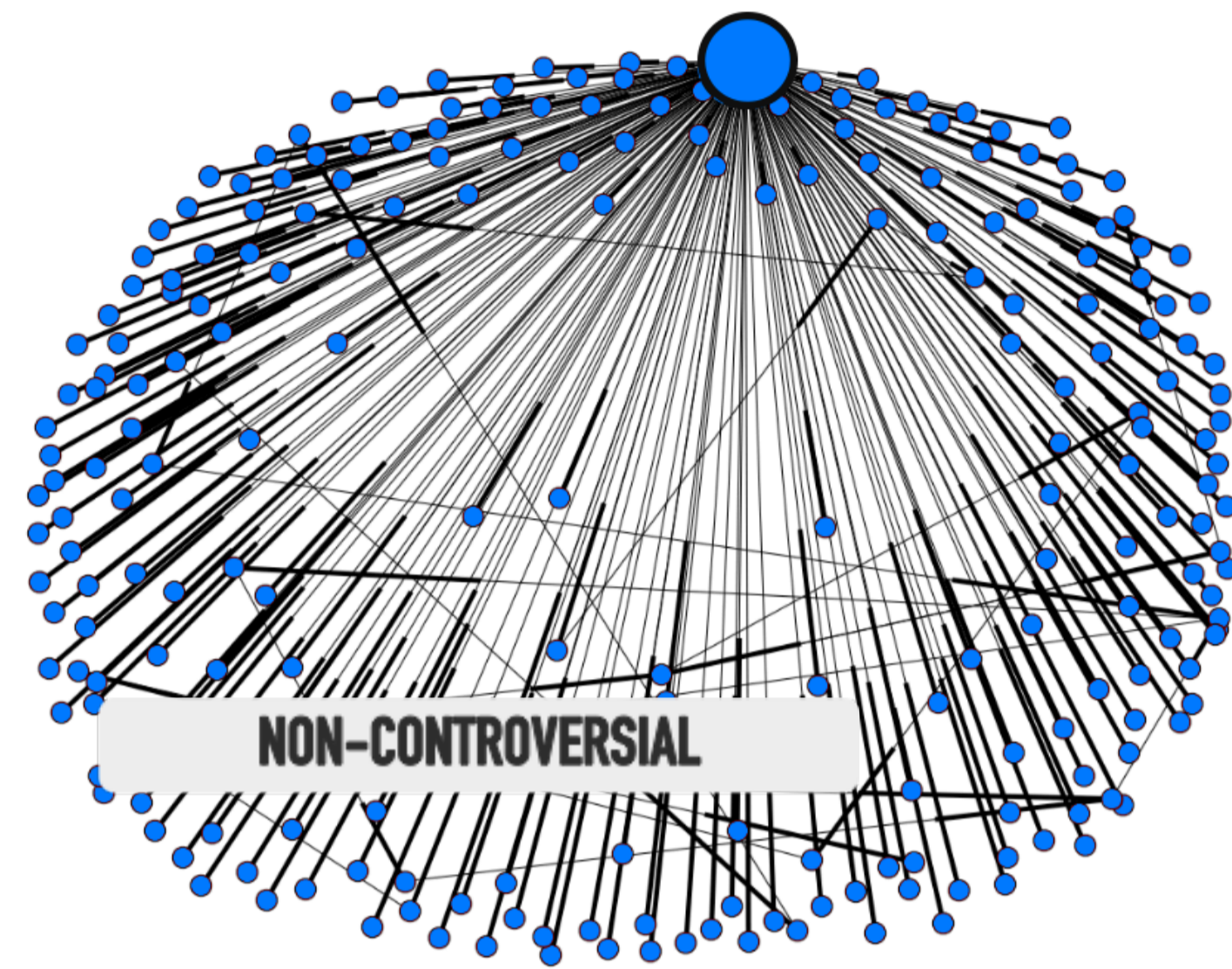
## Goal

- Algorithmically identify controversial discussions on Social Media



## How

- Exploiting network conversational motifs

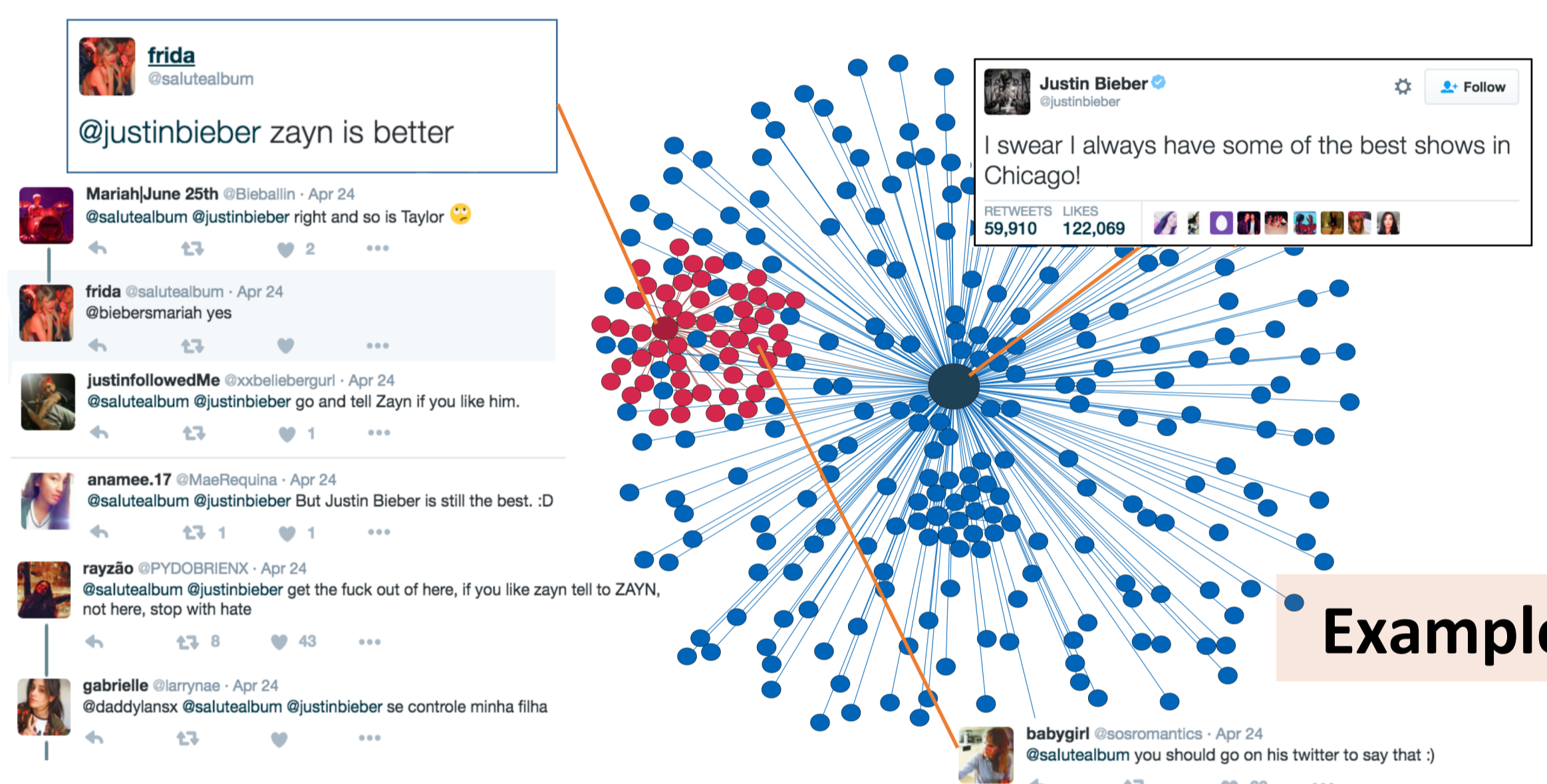


## Data

### Twitter pages

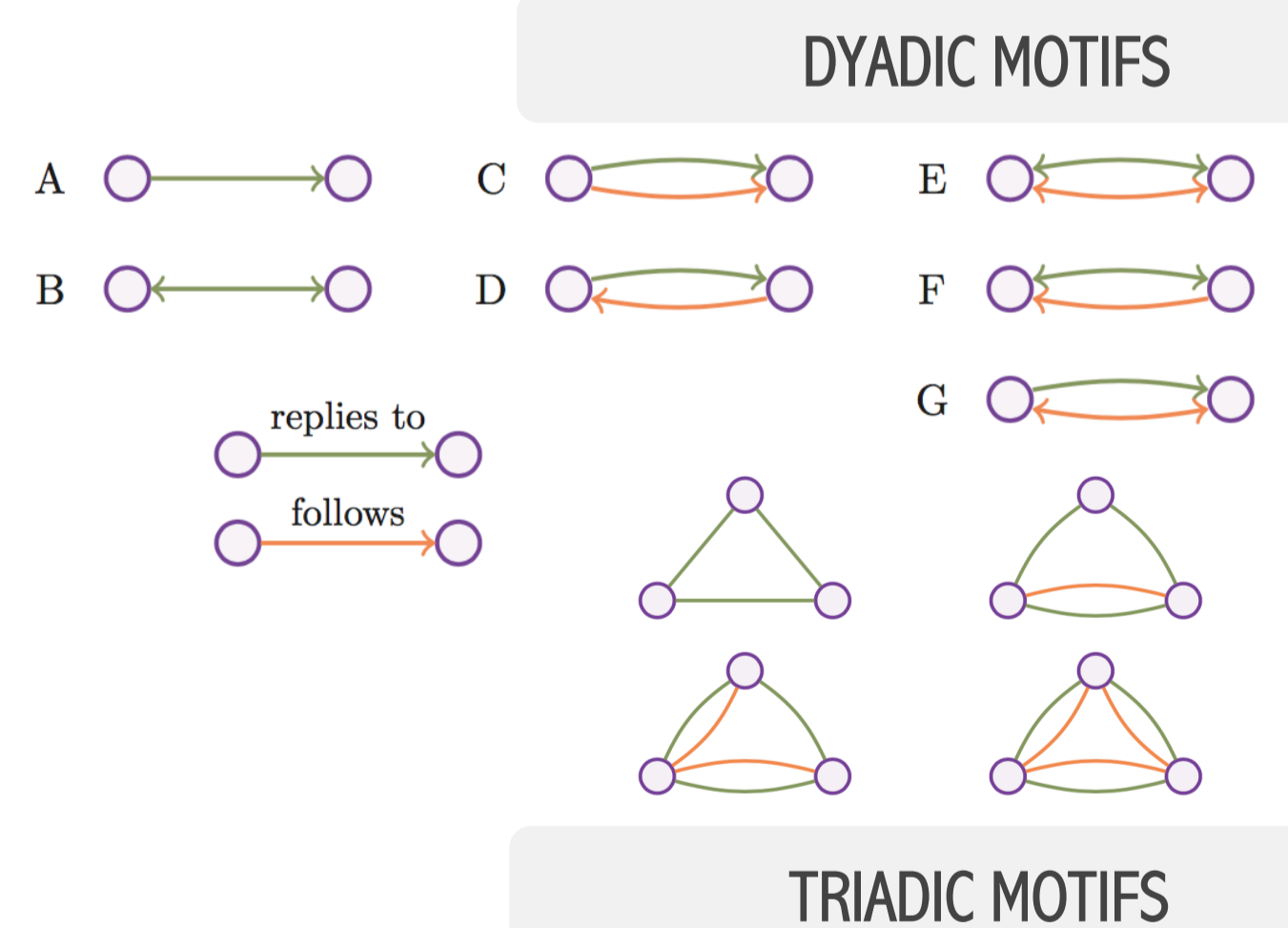
Filtering	Root posts	Avg. users	Tot. tweets
>2 users	1202	108	192.7K
>3 users	1175 (97%)	110	192.5K
>10 users	1046 (87%)	123	191.3K

<b>Controversial</b>	@tedcruz, @mov5stelle, @brexitwatch, @barackobama, @realdonaldtrump, @wikileaks, @berniesanders, @cnnbrk, @bbcworld, @hillaryclinton, @potus
<b>Non Controversial</b>	@coldplay, @justinbieber, @cristiano, @adele, @chanel, @xbox, @nba

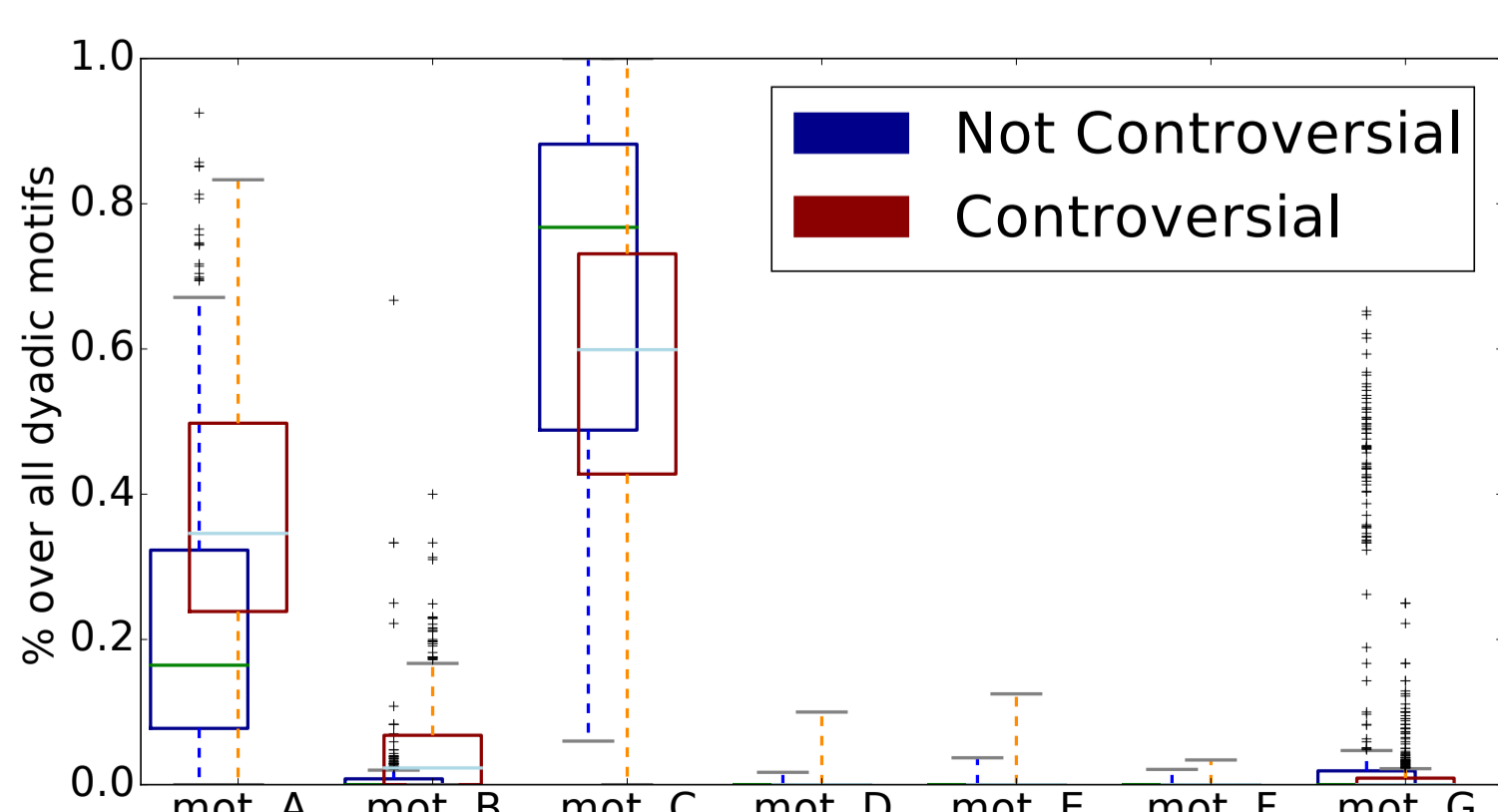


## Detail

- Features extracted from the User Graph and from the Reply Tree:
  - Structural** - e.g. Average Node Degree
  - Propagation based** - e.g. Average Cascade Depth
  - Temporal** - e.g. Average Inter-reply Time
  - Conversational Motifs** – Dyadic and Triadic
- Machine-Learning model: **ADA BOOST**, casted into a classification problem



## Results:



Method	Accuracy	Precision	Recall	F-measure
Baseline	<b>0.78</b>	0.81	0.83	<b>0.82</b>
Dyadic motifs only	<b>0.77</b>	0.79	0.84	<b>0.82</b>
Baseline + dyadic motifs	<b>0.84</b>	0.86	0.88	<b>0.87</b>
Baseline + dyadic and triadic motifs	<b>0.85</b>	<b>0.87</b>	<b>0.88</b>	<b>0.87</b>

+ 9%

+ 6%

- Best features**
- Avg. inter-reply time
  - Max. relative degree
  - Motif A**
  - % Replies within 1h
  - Motif B**
  - Motif G**

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