

The Anatomy of Large Facebook Cascades

Alex Dow (Joint work with Lada Adamic and Adrien Friggeri) July 8, 2013

Information Cascades



Recent research

Leskovec, J.; Singh, A.; and Kleinberg, J. 2006. Patterns of influence in a recommendation network.

> Bakshy, E.; Hofman, J. M.; Mason, W. A.; and Watts, D. J. 2011. Everyone's an influencer: Quantifying influence on Twitter.



Experience suggests otherwise



Photo Reshare Cascades



LIKE if Rescue if your favorite breed!

SHARE if your dog rescued you!





Like · Comment · Share



hared The Animal Rescue Site's photo.



Alex Dow shared The Animal Rescue Site's photo.

* /

LIKE if Rescue if your favorite breed!

SHARE if your dog rescued you!



Like · Comment · Promote · Share

Data description

- 1 million photos uploaded and reshared in January
- All reshares within two weeks of upload
- Two additional photos for detailed investigation (more later)

Cascade construction

Direct parent attribution: Where was "share" clicked? Click on friend's reshare ------> Share the original





bald bubby

Like · Comment · Share 76,606 people like this. 40,787

Top Comments -

- Inferred parent attribution: What led to the reshare?

How many cascades are large?

• Only 5% of photos get reshared at all



How many reshares are in large cascades?



Do cascades go deep?

- Vast majority of cascades are very small and shallow
- Even among cascades of size
 >100, most have most of their
 reshares at depth 1
- But, of those cascades, 15% have more than half of their reshares at depth >1



Two specific large cascades

Obama Victory Photo (OVP)

- > 7 million likes
- > 500,000 comments
- > 600,000 reshares

Timeline Photos

Back to Album · Barack Obama's Photos · Barack Obama's Page

Previous · Next





Album: Timeline Photos Shared with: R Public

Million Like Meme – Origin Story



More at KnowYourMeme.com:

http://knowyourmeme.com/memes/one-million-facebook-likes-pleas

The inevitable evolution

- Almost 2 million likes
- > 150,000 comments
- > 150,000 reshares
- MLM (Million Like Meme)



Temporal dynamics

In first 24 hours -- 96% of MLM shares -- 90% of OVP shares



Depth and rechaining



Cascade visualization







Rechaining with little effect





Subcascade branching factor

- Average reshares that followed directly from a single reshare



Branching factor by depth



Branching factor per audience member

- Avg bf increases with size of audience
- Each additional audience member contributes same or less to bf



Modeling reshares

- Direct influence (bf) vs. Indirect influence (subcascade size)
- Demographics, depth, and time had little explanatory power
- It all comes down to audience size:

Influence	Cascade	R ²
branching factor	OVP	0.49
	MLM	0.30
subcascade -	OVP	0.45
	MLM	0.10

Take aways

- Cascades are small and shallow
- But, large cascades exist, and a majority of reshares belong to them
- There is a significant number of cascades where most distribution is deeper than 1
- Inferred parent attribution (rechaining) can have a significant impact on cascade structure
- Audience size is important in explaining spread, but not the whole picture

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