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# Power-law revisited: A large scale measurement study of P2P content popularity

György Dán

School of Electrical Engineering  
KTH, Royal Institute of Technology  
Stockholm, Sweden

Niklas Carlsson

Department of Computer Science  
University of Calgary  
Calgary, Canada

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# P2P Content Popularity

- Instantaneous popularity
  - Concurrent number of peers
  - Effectiveness of locality awareness
  - Little data available
    - Power-law ?
- Download popularity
  - Number of peers that downloaded content
  - Effectiveness of caching
  - Several measurements
    - Power-law but flattened head (Mandelbrot-Zipf)
- Measurements limited in time and coverage
  - How accurate are they?
  - How accurate can they be?

L. Guo, S. Chen, Z. Xiao, E. Tan, X. Ding, and X. Zhang, Measurement, Analysis, and Modeling of BitTorrent-like Systems, in Proc. ACM IMC, Oct. 2005.

M. Hefeeda and O. Saleh, Traffic modeling and proportional partial caching for peer-to-peer systems, IEEE/ACM Trans. on Networking, vol. 16, no. 6, pp. 1447-1460, 2008.



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# Measuring P2P Content Popularity

- Overlay structure → Measurement methodology
  - Tracker based (BitTorrent)
    - Peer harvesting
    - Tracker query - scrape
    - Deep packet inspection
  - Unstructured (Gnutella, Ares, FastTrack)
    - Monitoring queries and replies
    - Deep packet inspection
- Measurement = Sample of population wide popularity
  - Probability sampling - difficult
  - Opportunity sampling
    - Inference can be misleading

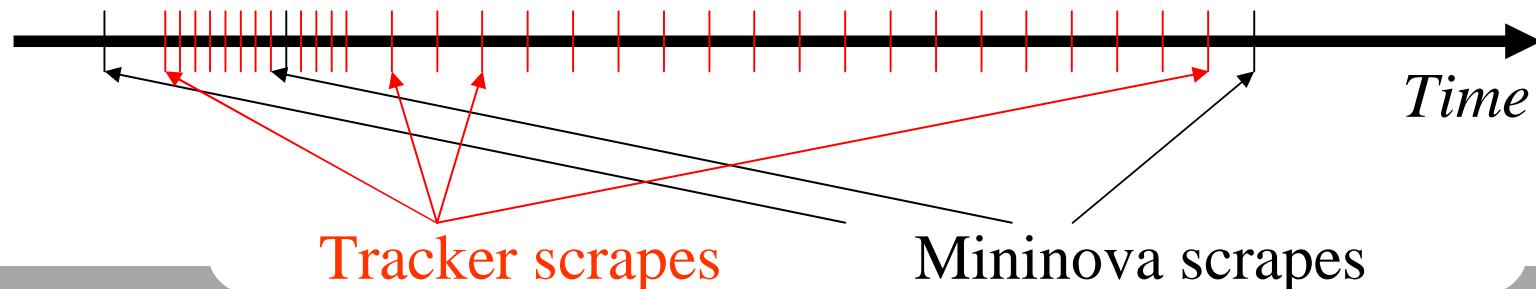


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# Measurement Methodology

- Screen scrape of *Mininova.org*
  - Largest torrent search engine
  - 31 Aug. 2008, 15 Oct. 2008, 31 Aug. 2009
  - Scrape URL of 1690 BitTorrent trackers
- Scrape of 721 BitTorrent trackers (S,L,D)
  - 15 Sept. 2008 to 17 Aug. 2009
    - weekly, daily at 8pm GMT
  - Almost instantaneous (<30mins)



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# Zipf's Law and Beyond

- Zipf's Law

$$f_{Zipf(f_1, \theta)}(r) = \frac{f_1}{r^\theta}$$

- Heavy tail

$$\lim_{r \rightarrow \infty} e^{ar} f_{Zipf(f_1, \theta)}(r) = \infty \quad \forall a > 0, \lambda \geq 0$$

- Mandelbrot-Zipf Law

$$f_{MZipf(f_1, \lambda, \theta)}(r) = \frac{f_1}{(\lambda + r)^\theta}$$

- Flattened head

- Generalized Zipf Law

$$f_{GZipf(f_1, \lambda, \mu, \theta)}(r) = \frac{f_1}{(1 - \lambda / \mu + (\lambda / \mu) e^{(1/\theta)\mu r})^\theta}$$

- Light tail

$$\lim_{r \rightarrow \infty} e^{ar} f_{GZipf(f_1, \lambda, \mu, \theta)}(r) < \infty \quad \exists a > 0, \lambda \geq 0$$

- Flattened head

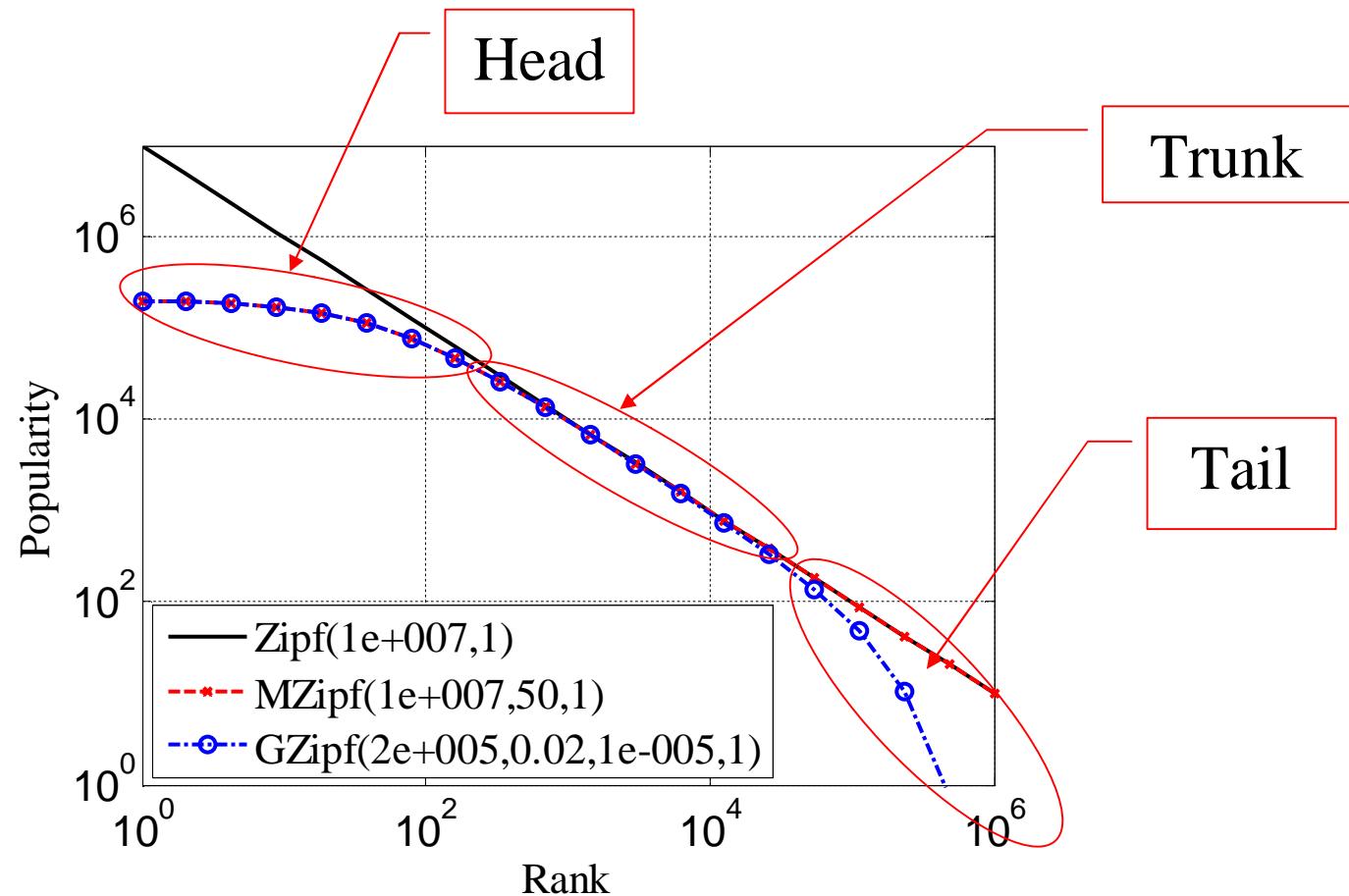
- Power-law trunk



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# Zipf's Law and Beyond - Example



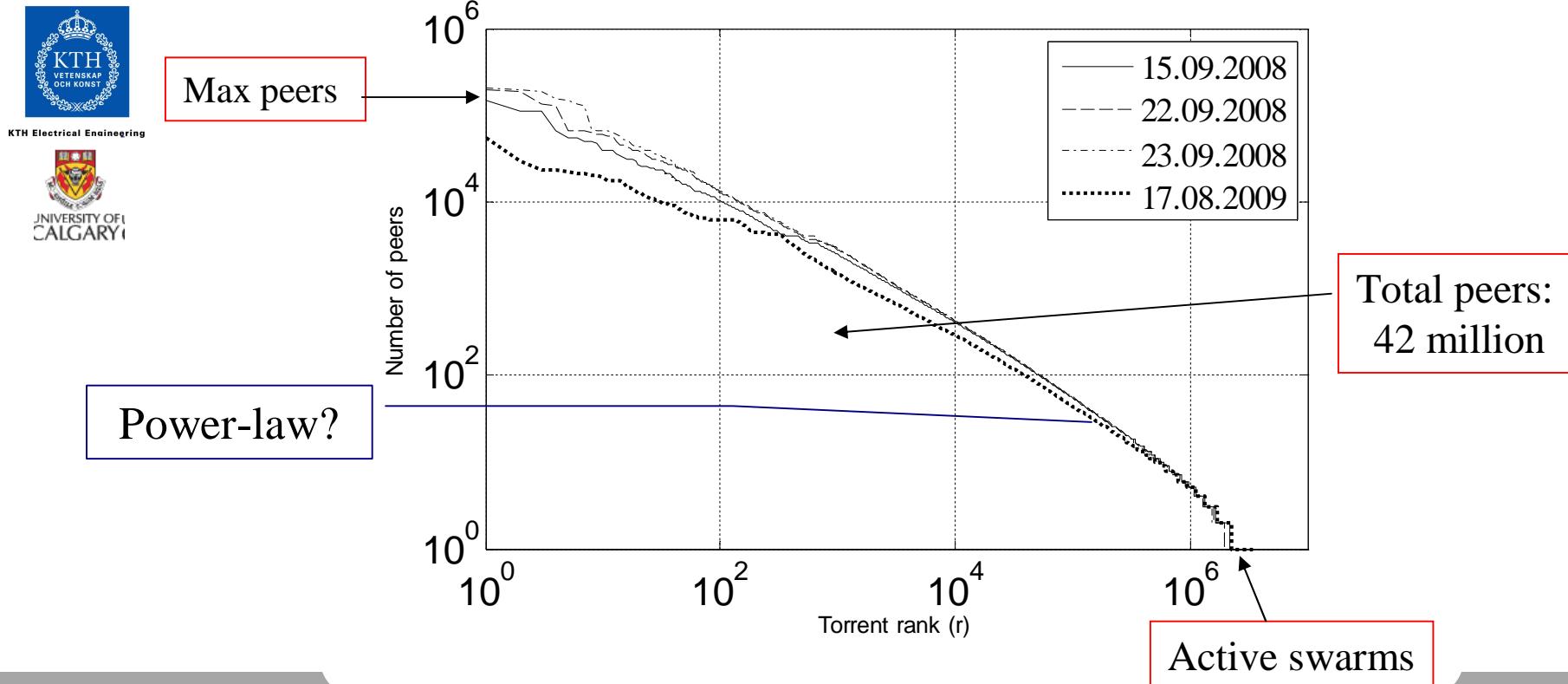
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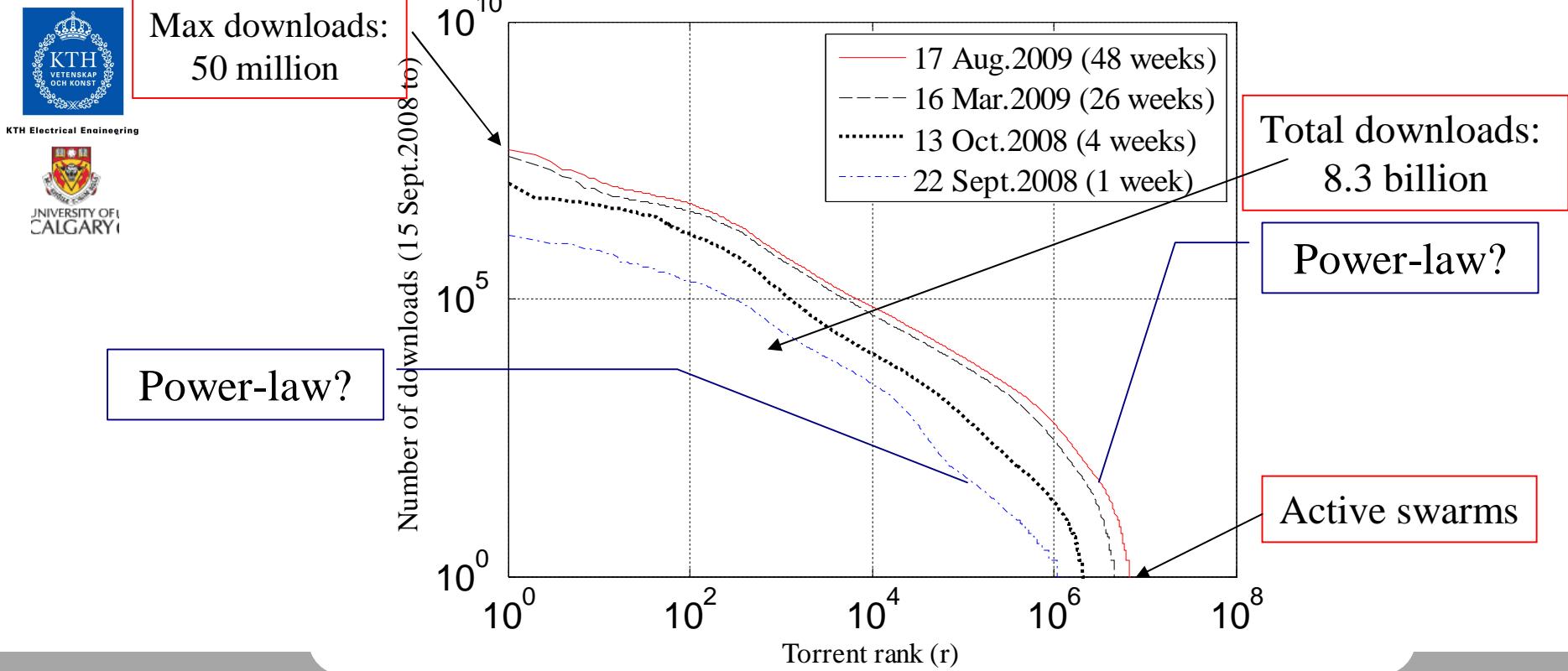
# What we measured (I)

- Instantaneous popularity



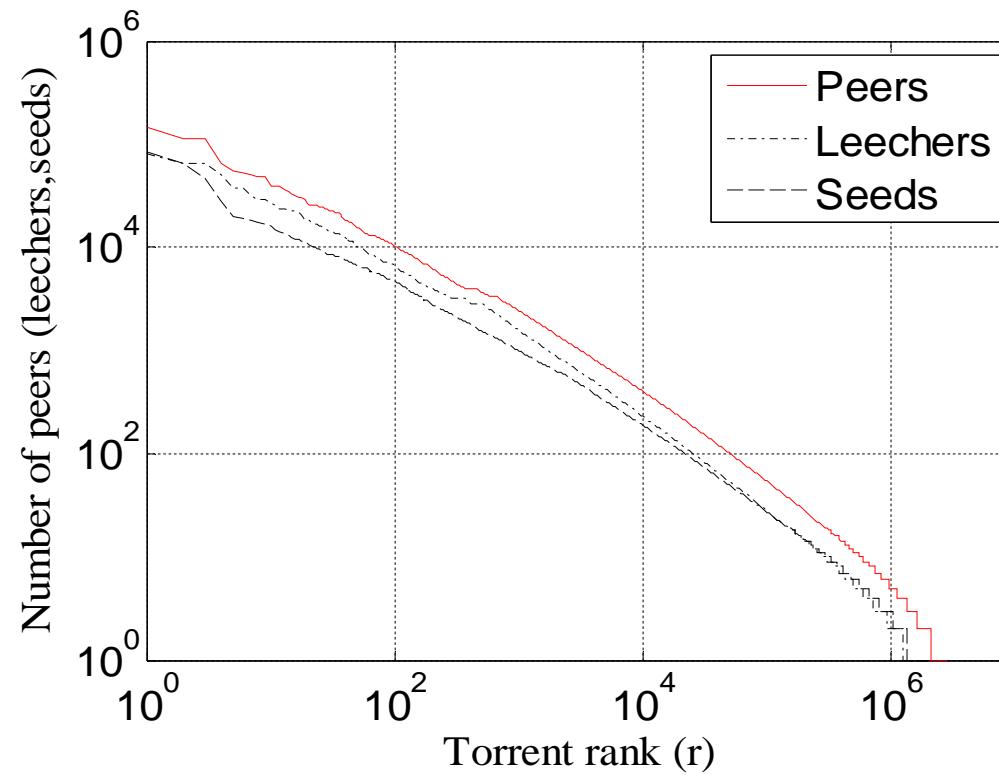
# What we measured (II)

- Download popularity



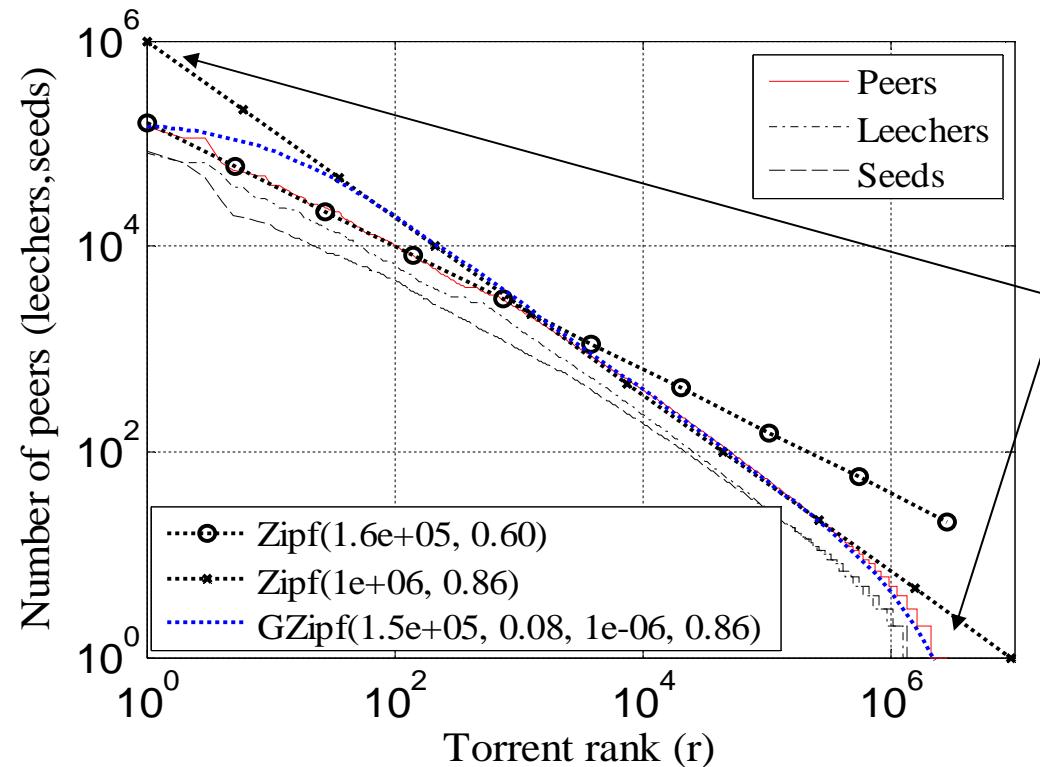
# Instantaneous Popularity

- Instantaneous popularity 15 Sept 2008, 8pm GMT
  - Max:  $1.6 \times 10^5$ , Total:  $4.23 \times 10^7$ , Active:  $2.93 \times 10^6$



# Power-law or Double-power-law?

- Instantaneous popularity 15 Sept 2008, 8pm GMT
  - Max:  $1.6 \times 10^5$ , Total:  $4.23 \times 10^7$ , Active:  $2.93 \times 10^6$



Power-law trunk hypothesis:  
-Max:  $10^6$   
-Total:  $6.1 \times 10^7$   
-Active:  $9.5 \times 10^6$

Sampling artifact?

# Sampling and Exponential cutoff

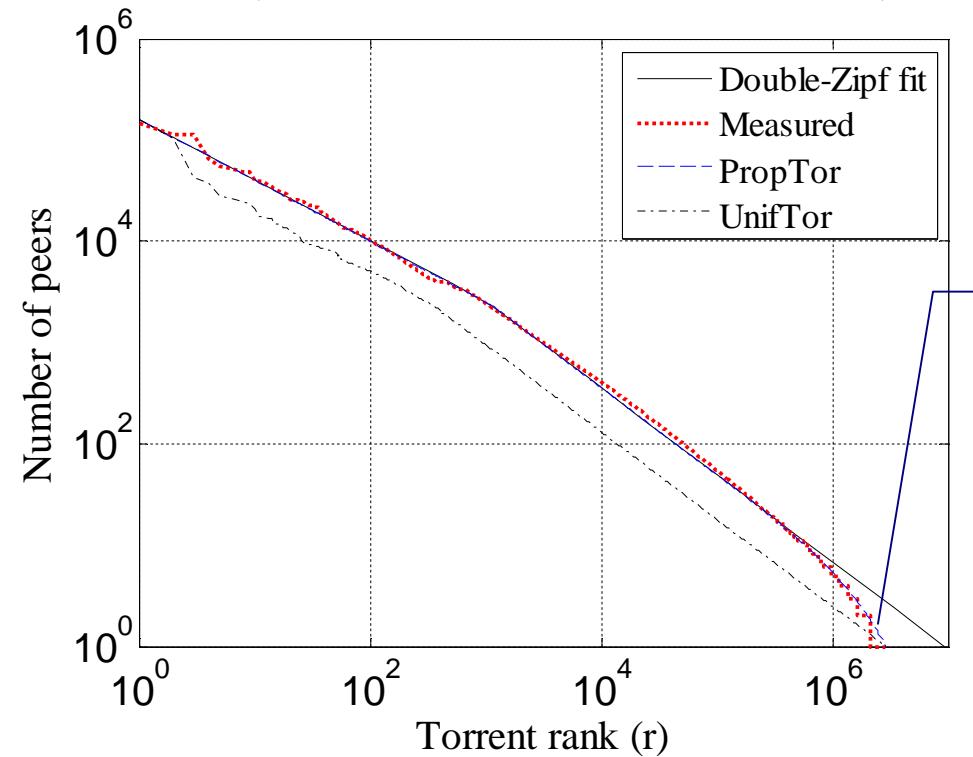
- Instantaneous popularity 15 Sept 2008, 8pm GMT
  - $2.93 \times 10^6$  samples from Double-Zipf in two ways
    - PropTor (discover torrent proportional to its popularity)
    - UnifTor (discover torrent uniform at random)



Total:  $4.23 \times 10^7$

Total:  $4.02 \times 10^7$

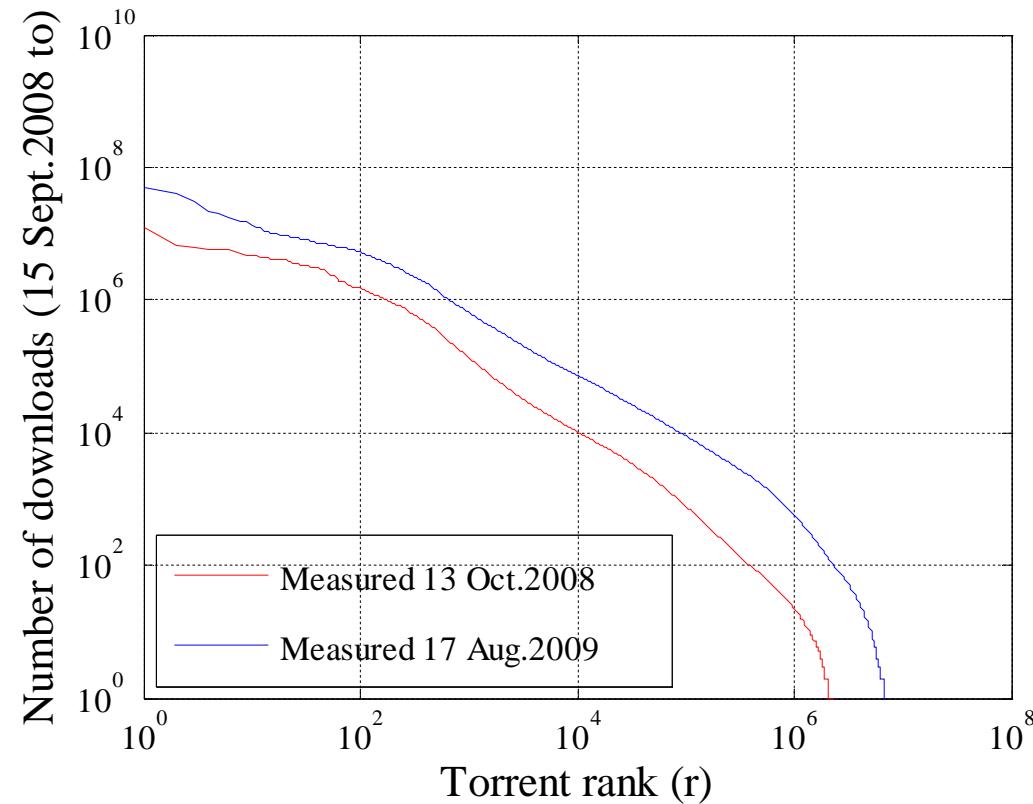
PMCC=0.99



*PropTor*  
sampling  
introduces  
exponential  
cutoff

# Download Popularity

- Download popularity over 4 and 48 weeks
  - Active:  $2.29 \times 10^6$  and  $7.17 \times 10^6$  torrents



# Power-law vs. Exponential cutoff

- Download popularity over 4 and 48 weeks
  - Active:  $2.29 \times 10^6$  and  $7.17 \times 10^6$  torrents

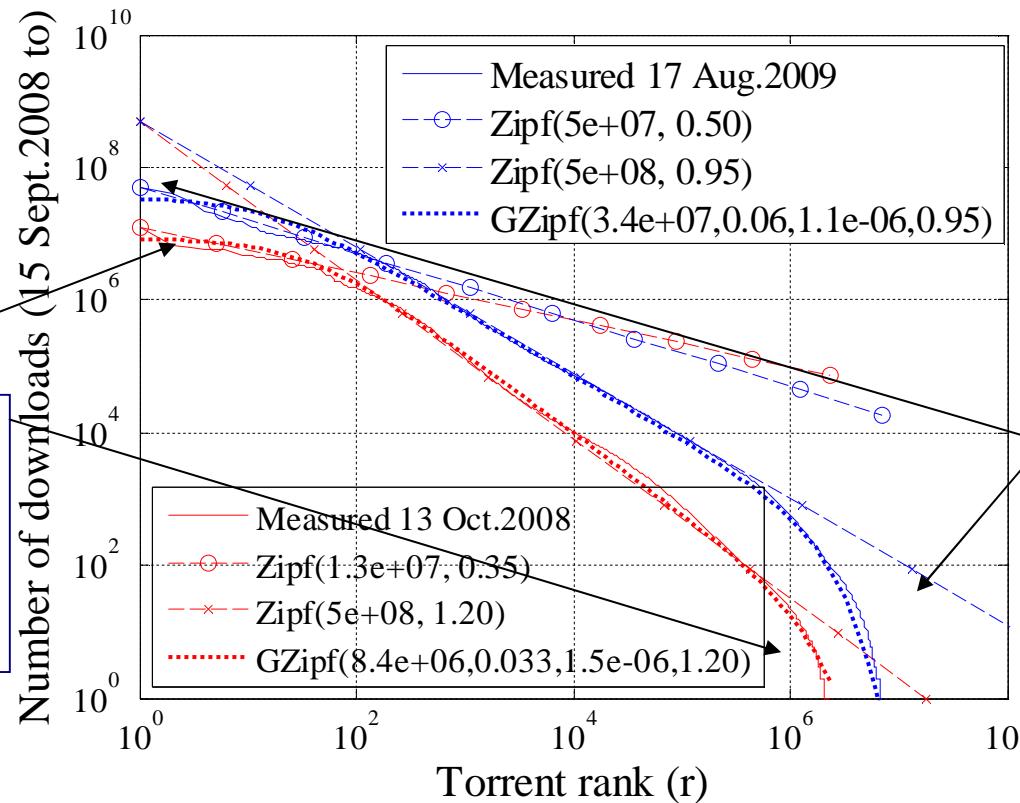


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4 weeks  
Double power-  
law hypothesis:  
-Active:  $1.77 \times 10^7$



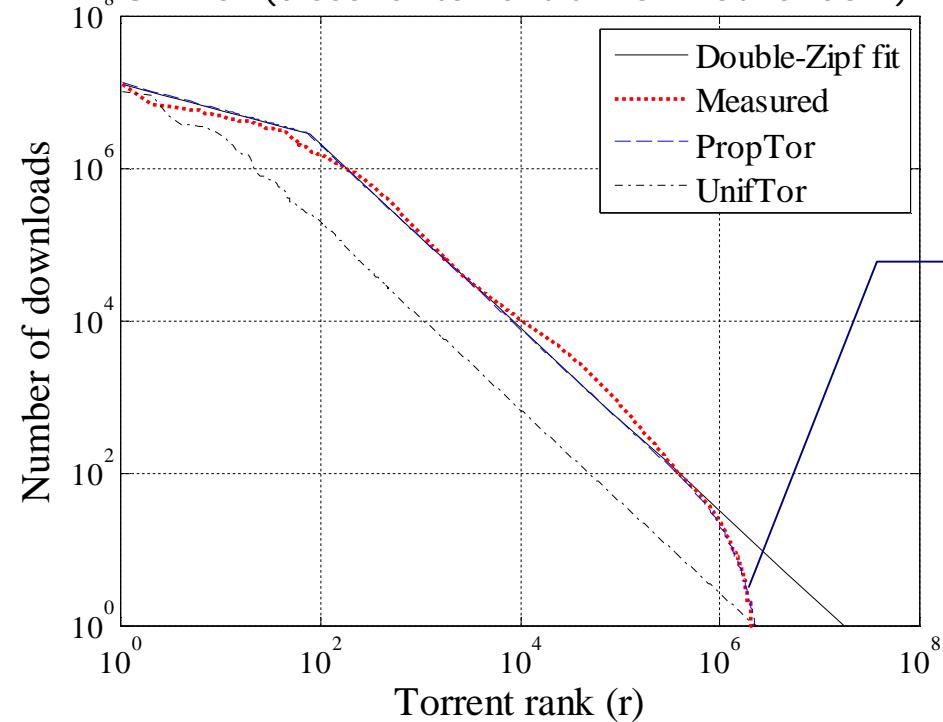
48 weeks  
Double power-  
law hypothesis:  
-Active:  $1.43 \times 10^9$

# Sampling and Exponential cutoff

- Download popularity over 4 weeks (15 Sept. 2008-13 Oct. 2008)
  - $2.29 \times 10^6$  samples from Double-Zipf in two ways
    - PropTor (discover torrent proportional to its popularity)
    - UnifTor (discover torrent uniform at random)



Total:  $1.31 \times 10^9$   
Total:  $1.21 \times 10^9$   
PMCC=0.99



*PropTor*  
sampling  
introduces  
exponential  
cutoff

# Impact of Sampling

Large torrents  
overrepresented

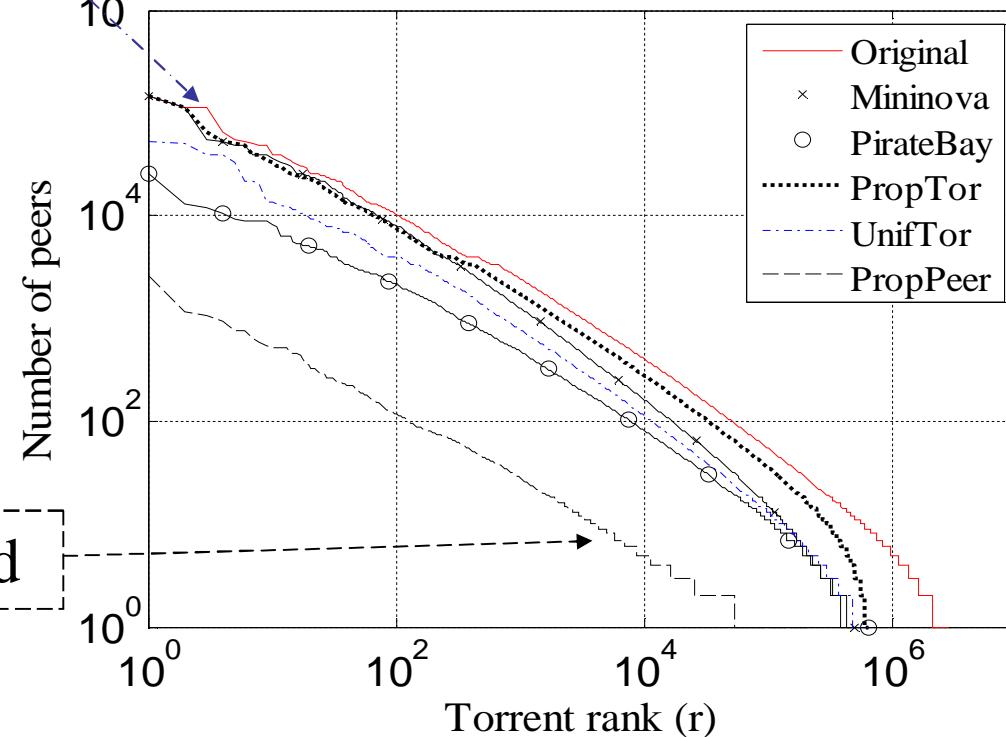


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- Instantaneous popularity 15 Sept 2008, 8pm GMT
  - $2.93 \times 10^6$  active torrents,  $4.23 \times 10^7$  total peers
  - sampled in 5 ways



PirateBay, PropTor,  
UnifTor:  
 $6.55 \times 10^5$  torrents

PropPeer:  $4.23 \times 10^5$   
peers (1% of total)

Mininova:  $9.7 \times 10^5$   
torrents

# Impact of Sampling

Large torrents  
overrepresented

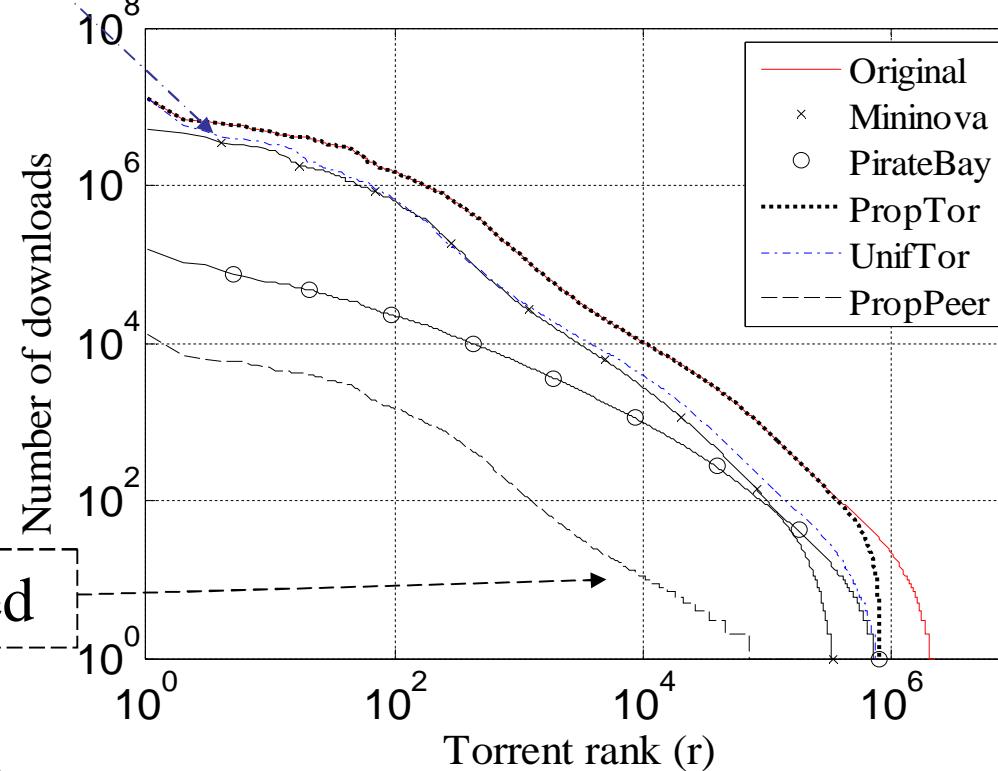


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- Download popularity over 4 weeks
  - $2.29 \times 10^6$  active torrents,  $1.31 \times 10^9$  total downloads
  - Sampled in 5 ways



Heavy-tailed

PirateBay, PropTor,  
UnifTor:  
 $1.69 \times 10^6$  torrents

Mininova:  $4.95 \times 10^5$   
active torrents

PropPeer:  $1.31 \times 10^6$   
peers (0.1% of total)

# Summary

- Large measurement study of P2P content popularity
  - Instantaneous popularity
  - Download popularity
- Instantaneous popularity
  - Power-law head?, power-law trunk
  - Tail *may be* power-law
- Download popularity
  - Flat head, power-law trunk
  - Tail *may be* power-law for short periods
    - Not power-law for long periods
- Sampling and measured characteristics
  - Infer with care



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