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Viral Entertainment as a Vehicle for Disseminating Development Services

Agha Ali Raza

Call me "Ali"

ICT4D

Information and Communication Technologies for Development

More and better information and communication furthers the development of a society.

To achieve impact at a massive scale:

- Robust solutions to reach the masses using available means with minimum resource expenditures

How do you reach low-literate masses?

- TV, radio are non-interactive
- PCs are not feasible
- Smart phones are not always feasible
- Text is problematic for the non-literate

Speech over simple phones is a viable way to reach low-literate masses



Challenges: User Training, Motivation, and Mass Dissemination

1. How do you train low-literate masses to use telephone based speech interfaces?

- Explicit user training is not scalable.

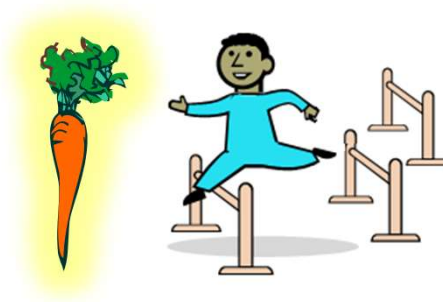
2. How to advertise / communicate to masses who don't read?



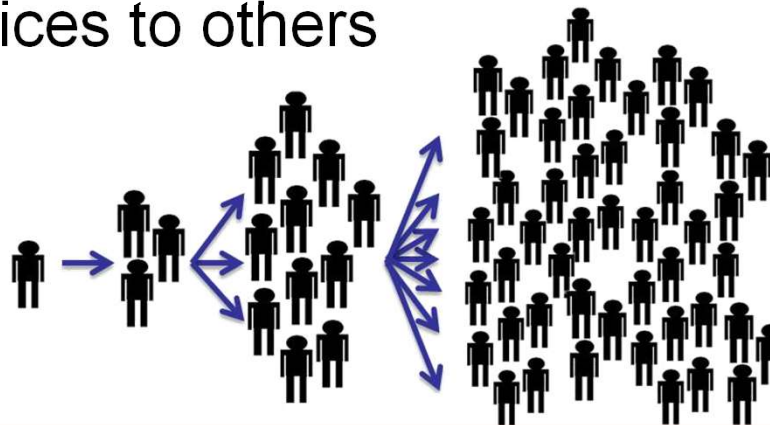
Our Strategy: Viral Entertainment

Use simple voice-based entertainment to incentivize people to:

1. Train themselves and overcome UI hurdles



2. Spread these services to others



Use ***Viral Entertainment*** as a vehicle
for disseminating ***Development***
related telephone-based services



Development services

Examples include speech-based:

- Marketplace (Craig's List), Citizen Journalism, message boards/blogs
- Health, agriculture, jobs, education,...
- Information gathering through surveys and polls,...

Polly (میاں مٹھو)

Polly is a **telephone-based, voice-based** service which allows users to make a short recording of their voice, **modify it** and **send the modified version to friends**.



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This brief video depicts a typical user interaction with Polly

USER INTERFACE

Job Audio-Browser

1. Scan Pakistani newspapers for jobs for low-skilled workers



Ref: paperpk.com



2. Record these ads
3. Invite Polly's users to audio-browse them

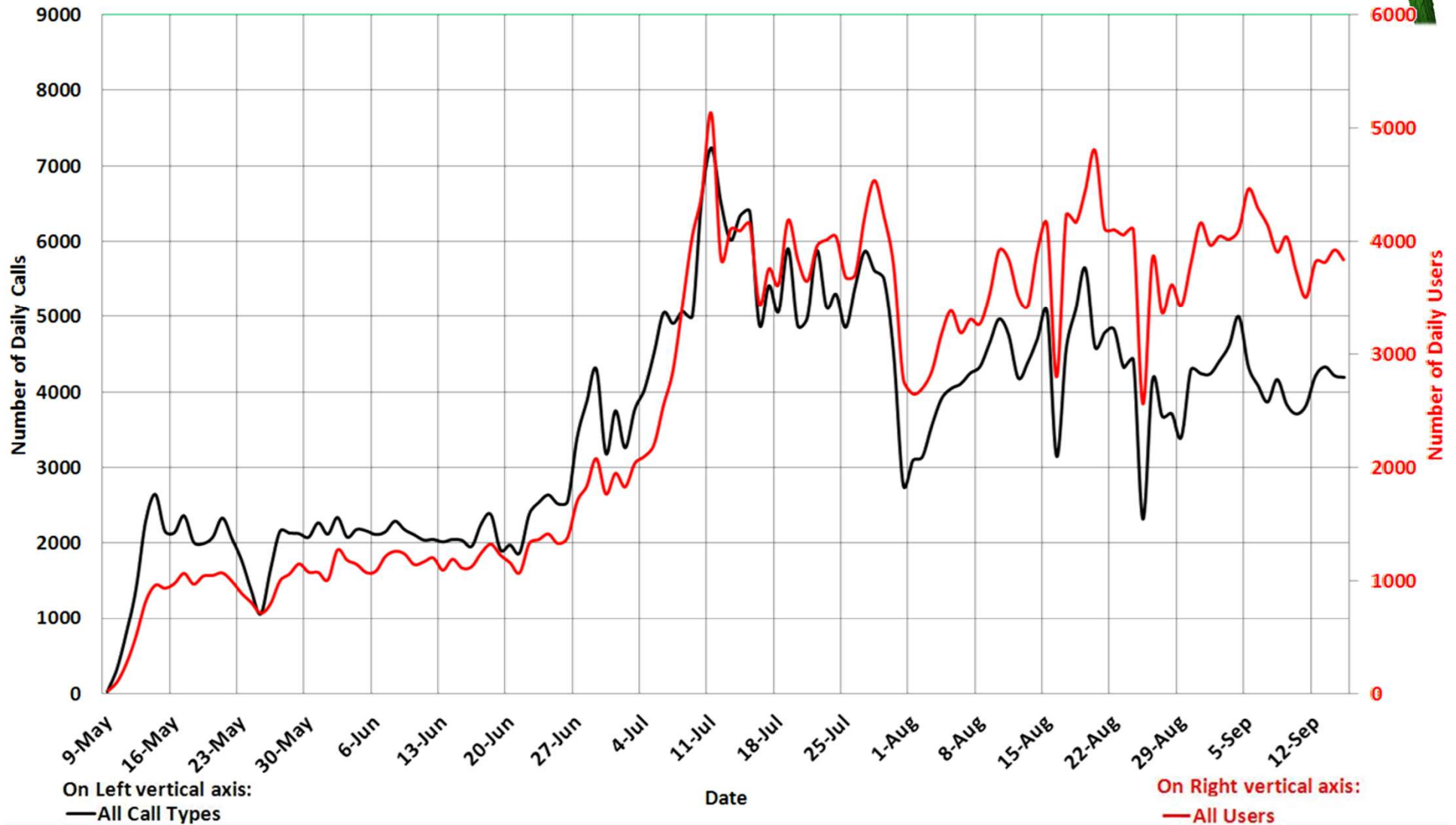
Deployment in Lahore



- Launched on May 09, 2012:
 - Seeded with **5 users**
- After **4.5** months (mid-September 2012):
 - **495,000** calls
 - **85,000** users
 - Spreading to **1,000 new people daily**
 - **27,000** people used the job search service
 - listened **279,000** times to job ads
 - and forwarded them **22,000** times to their friends.



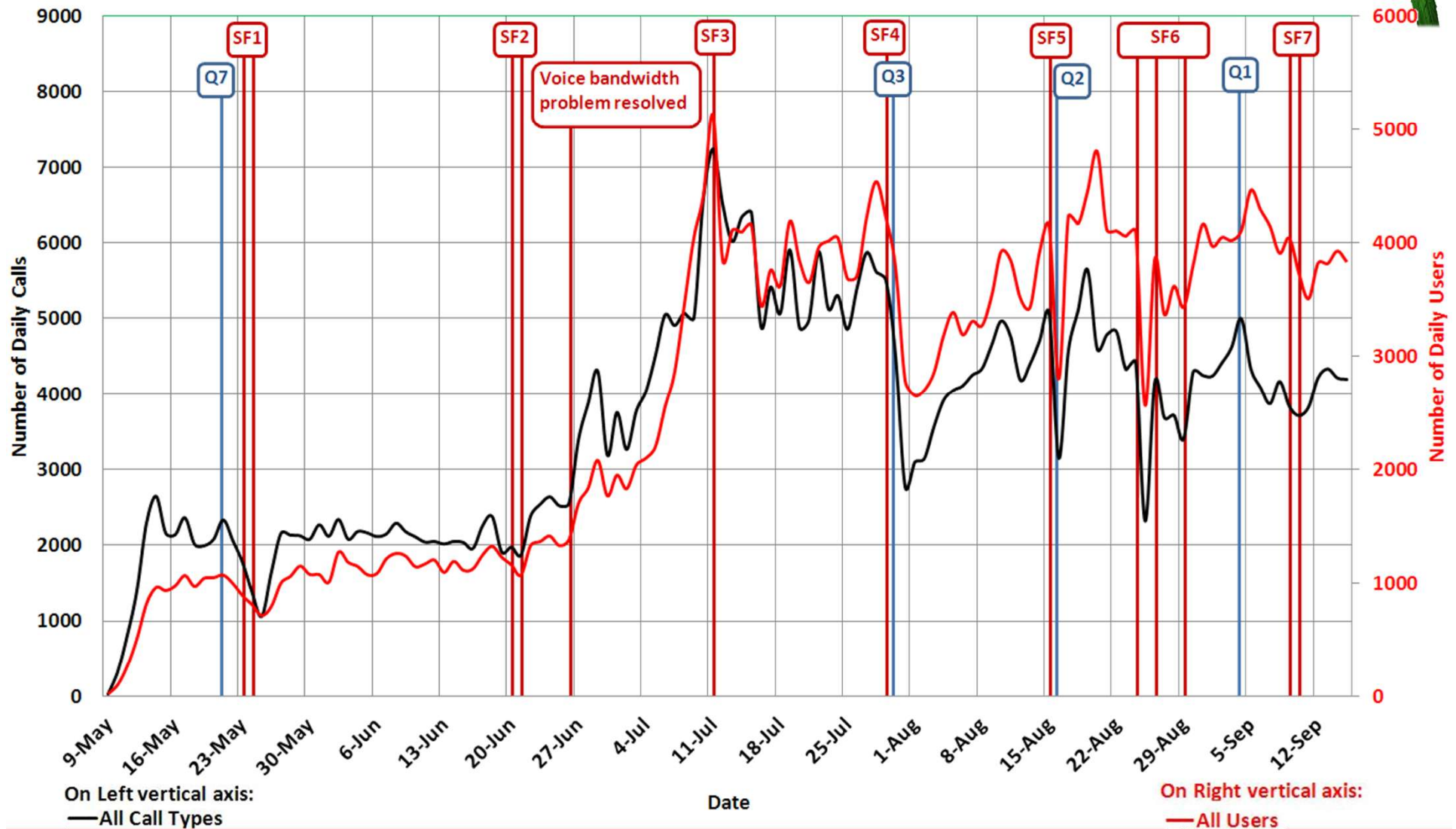
Deployment in Lahore



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Deployment in Lahore



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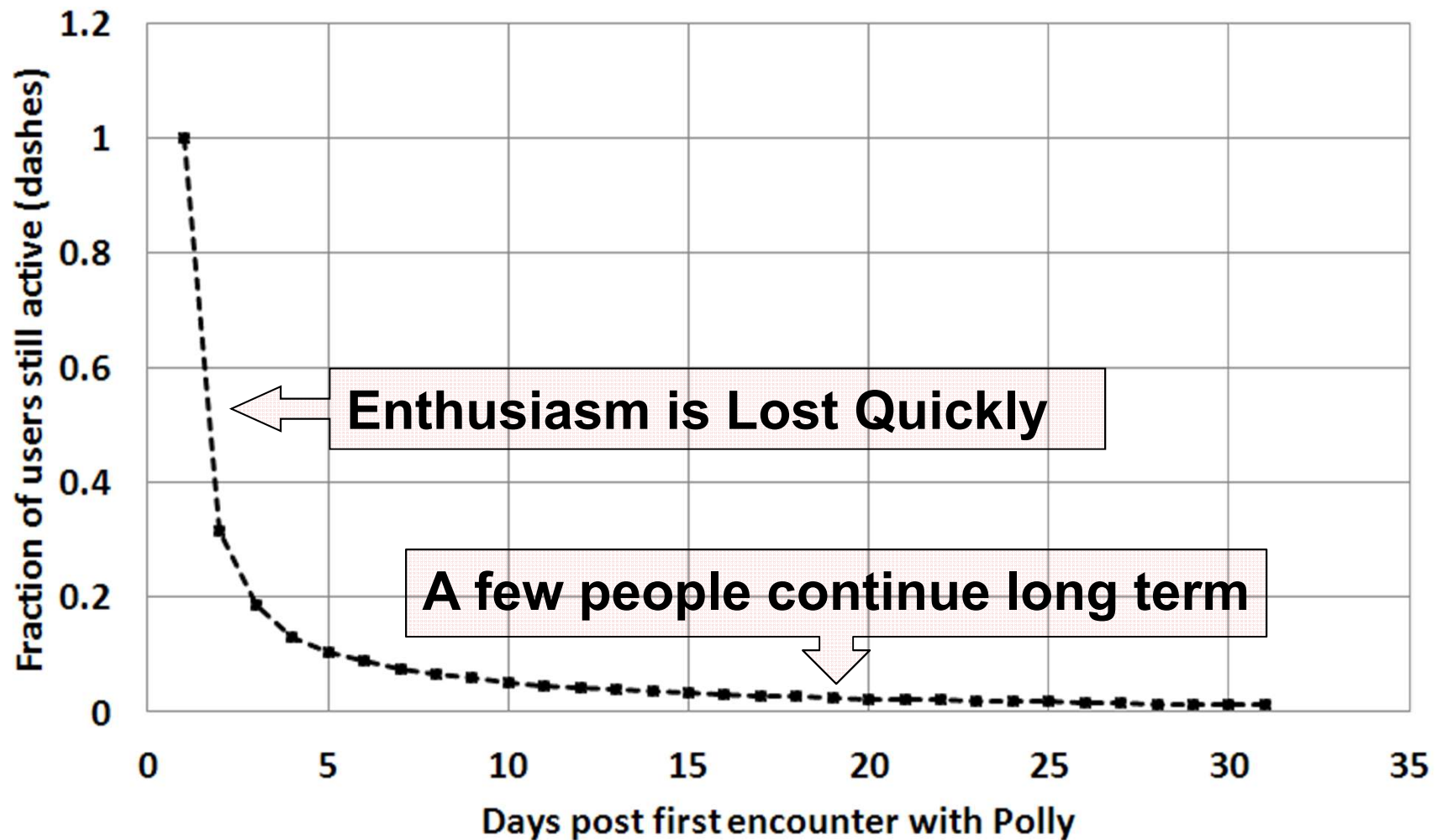
Deployment in Lahore

Started with **5 users**

- After a year:
 - **636,000** calls
 - **165,000** users
- **34,000** people used the job search service
- listened **386,199** times to **728** job ads
- and **19,000** users forwarded them to their friends.

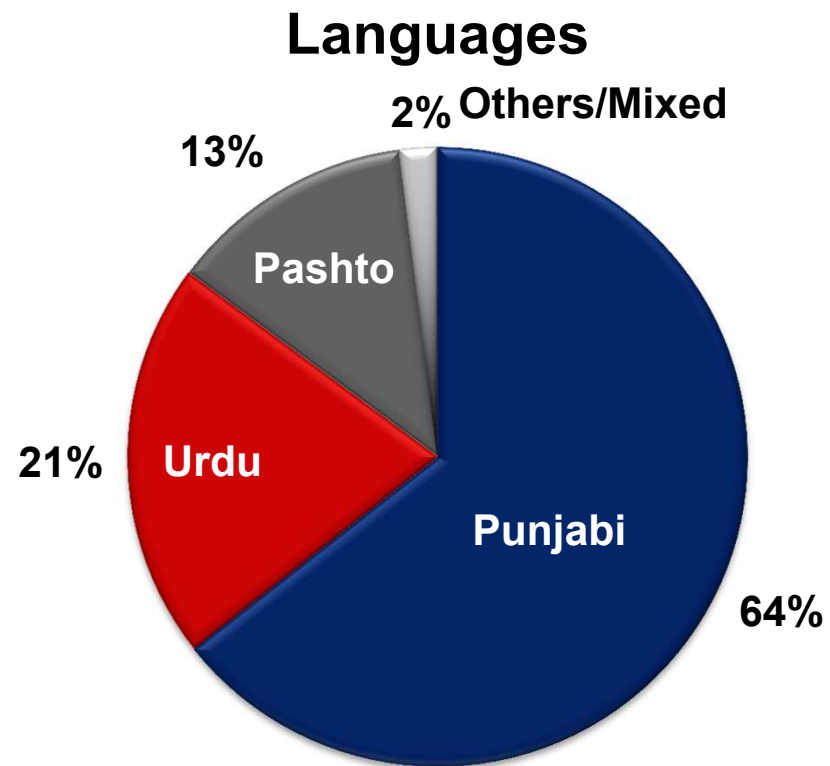
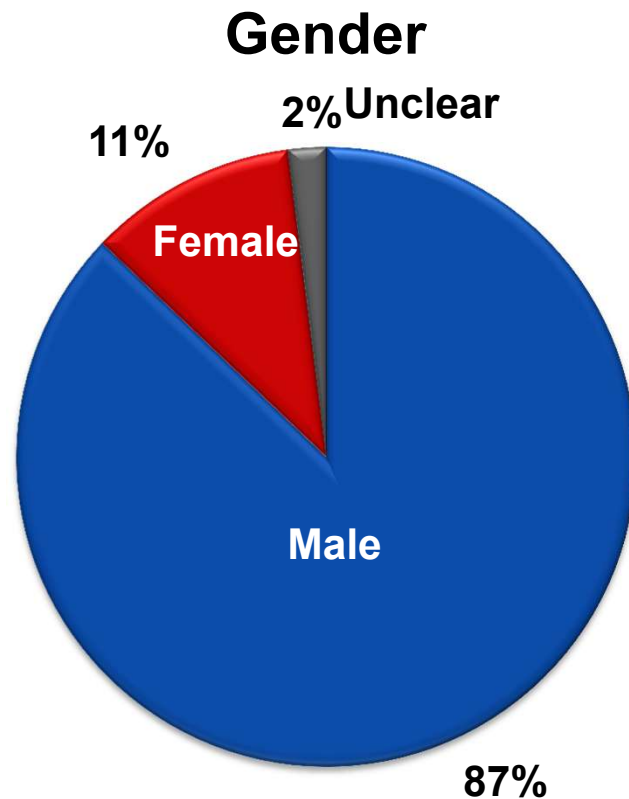
Raza et al. 2013, CHI, *best paper award*.

User Retention



User Demographics

Determined by listening to a sample of recordings:

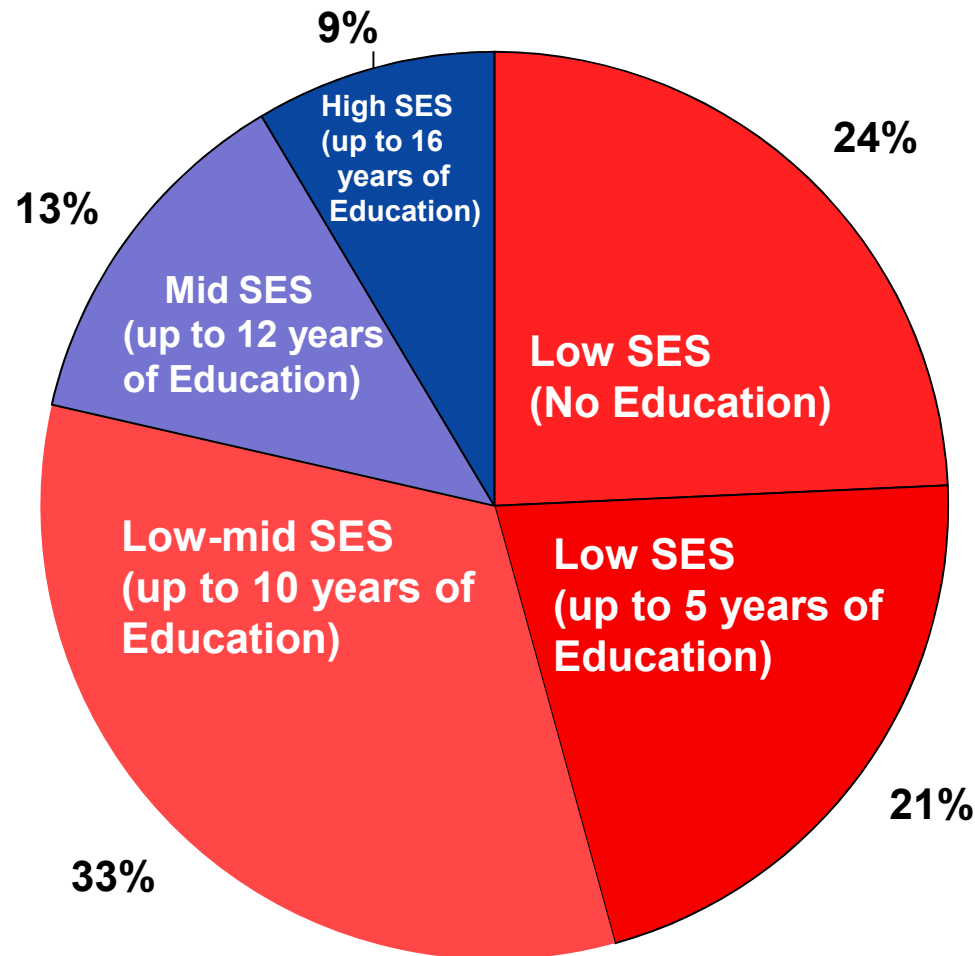


Used mostly by Punjabi speaking men...

User Demographics

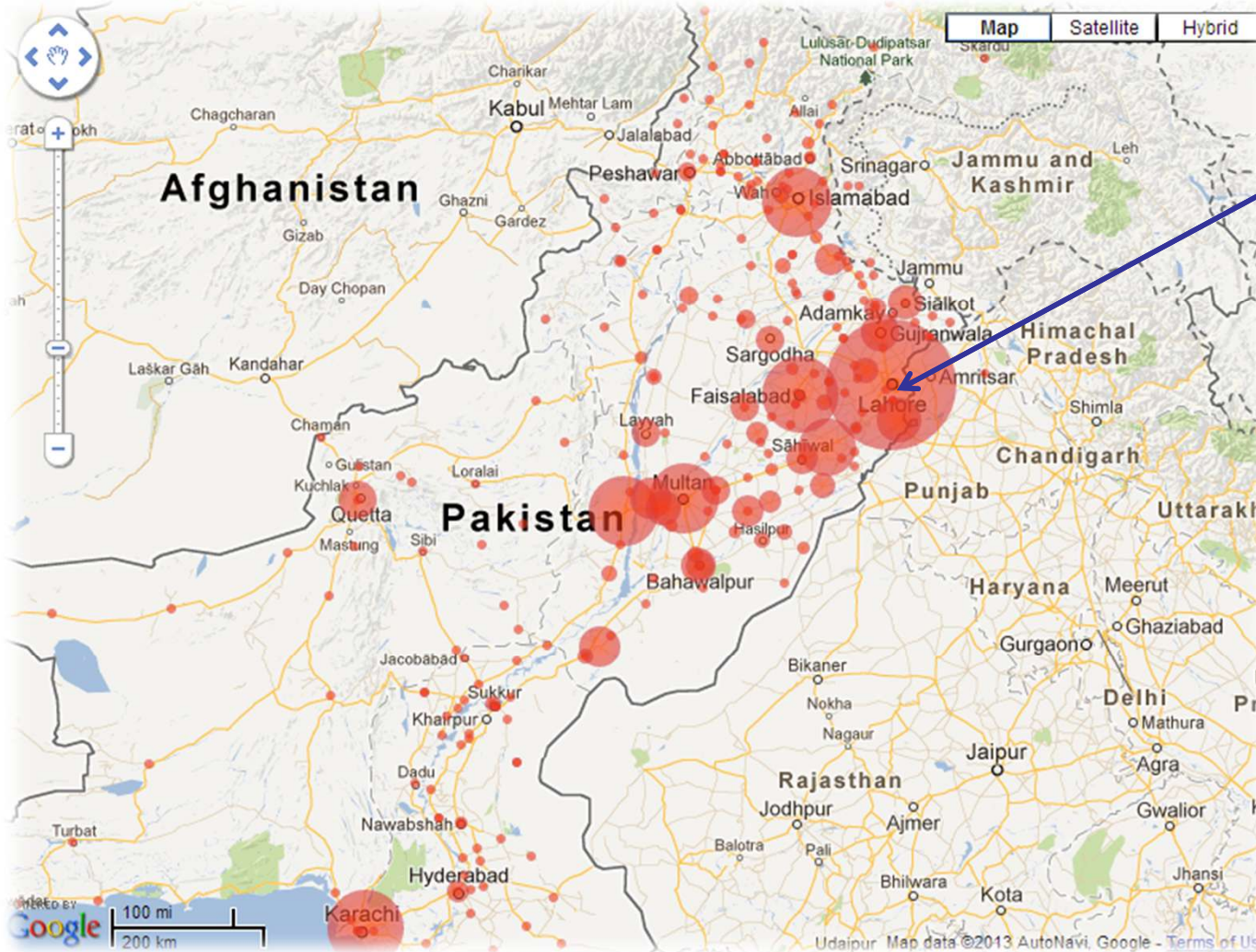
Estimated from 207 survey calls

Socio-Economic Status



Primarily used by
low-educated,
low-income people

Geographical Spread



- Seeded in Lahore and Okara
- Reached all parts of Pakistan.
- And also a handful of calls from:
 - India
 - Belgium
 - Oman
 - Saudi Arabia
 - UAE



Major Development Services

- **Job Audio-Browser¹**: Audio browse newspaper job ads appropriate for low-skilled workers (Pakistan; 2011-12)
- **Babajob.com²**: Audio portal for entry level jobs (India; 2013-14)
- **Jharkhand Mobile Vaani³**: Cross-spread Polly and a citizen radio-over-phone platform (India; 2014-15)
- **Ebola Healthline⁴**: Browse and spread authoritative messages about Ebola (Guinea; 2014-present)

¹ Raza et al. 2013, CHI, *best paper award*.

² Raza et al. 2016, ICTD.

³ Unpublished. Being analyzed.

⁴ Wolfe et al. 2015, SLaTE, InterSpeech.

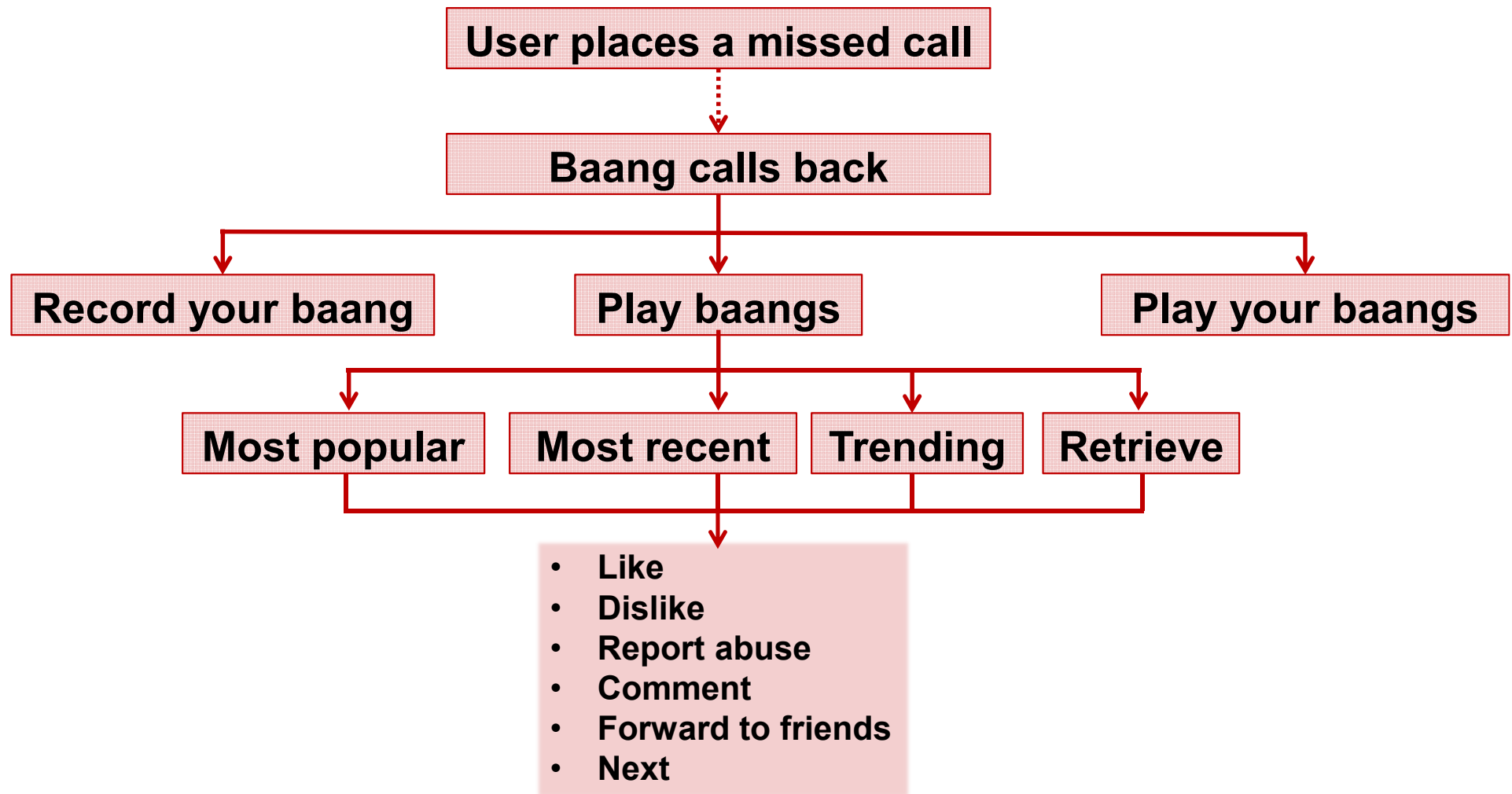
New Speech Services

- **Baang¹**: A voice-based, telephone-based community forum (Pakistan; 2015-16)
- **Sawaal¹**: A voice-based, telephone-based community quiz/question answering (Pakistan; 2015-16)

¹ Unpublished. Being analyzed.

Baang (بانگ)

A voice-based “reddit” for the low-literate



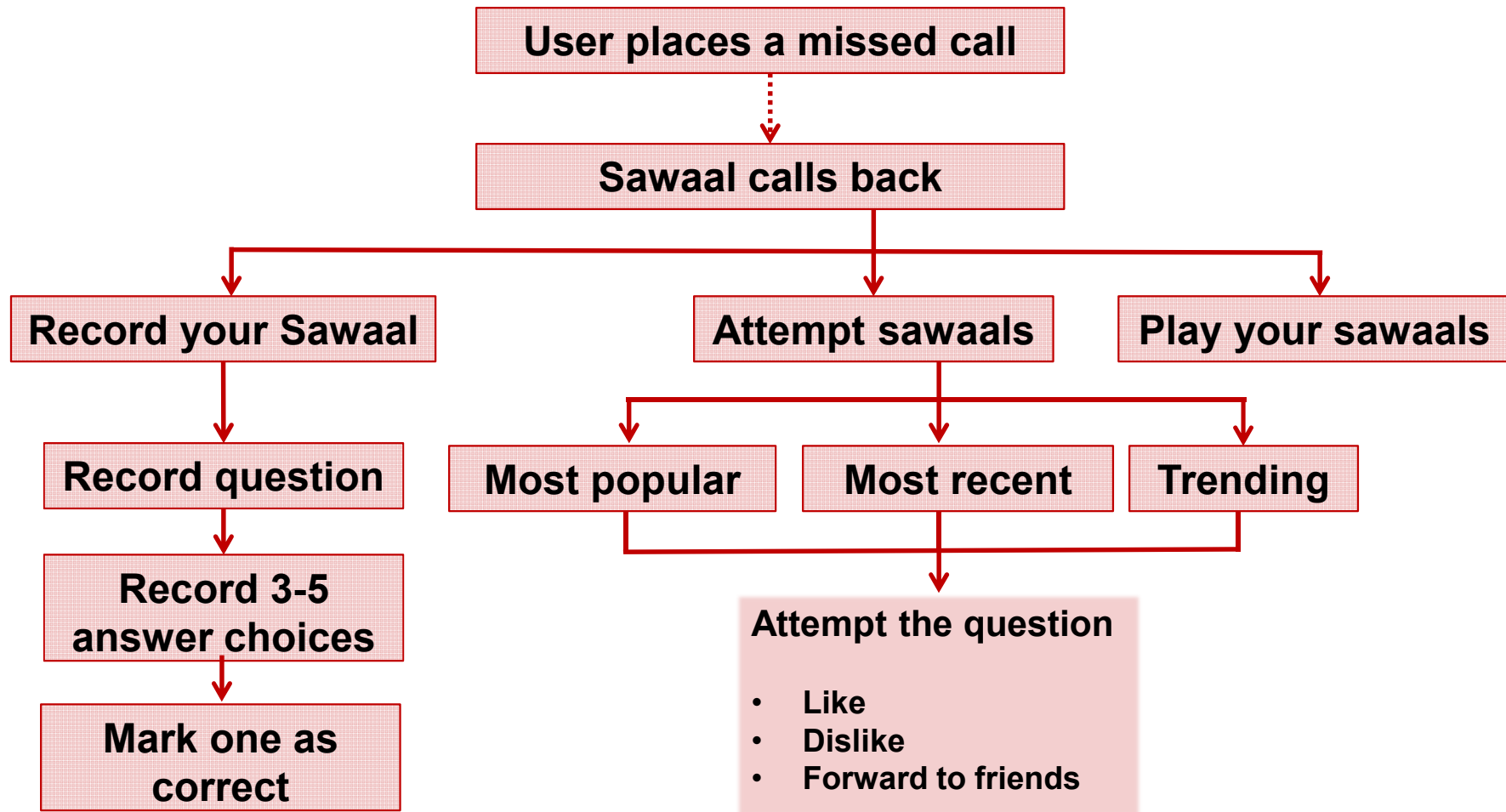
Baang (بانگ)

Within 3 months of its launch *Baang* has accumulated:

- **8,432** posts by **888** users
- Played **393,448** times by **1,524** users
- **101 hours** of speech data
- Among the most popular baangs are:
 - Songs
 - Religious poetry
 - Quranic recitation
 - Jokes, quotes etc.

Sawaal (سوال)

A voice-based community quiz for the low-literate



Sawaal (سوال)

Within a month *Sawaal* accumulated:

- **8,907** calls by **575** users
- **2,700** valid questions by **160** users (overall 3,176 by 201 users)
- Were attempted **74,000** times by **400** users
- Forwarded **6,800** times to friends
- **38 hours** of speech data
- Categories
 - Sports
 - Religion
 - History
 - General knowledge.

Summary

Opportunities

- Spreads virally and exponentially
- “Filters” target audience and stays among low-SES masses
- Delivers development-related services
- Trains and motivates users
- Quick and easy to deploy and made multilingual

Challenges

- Airtime!
- Committed local partners for setup, translations, recording, seeding

For more details please visit

<http://www.cs.cmu.edu/~araza/>



Thank you!



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Analysis of User Behavior

(with Yibin Lin and Haohan Wang)



Does more experience using Polly lead to:

1. an improvement in users' interaction skills?
 - a) Use of more advanced features,
 - b) Fewer mistakes.
2. any change in usage preferences?

(Analyses are based on: **50,414** users, **292,951** calls, **934,742** menu interactions and **were controlled for user experience**)



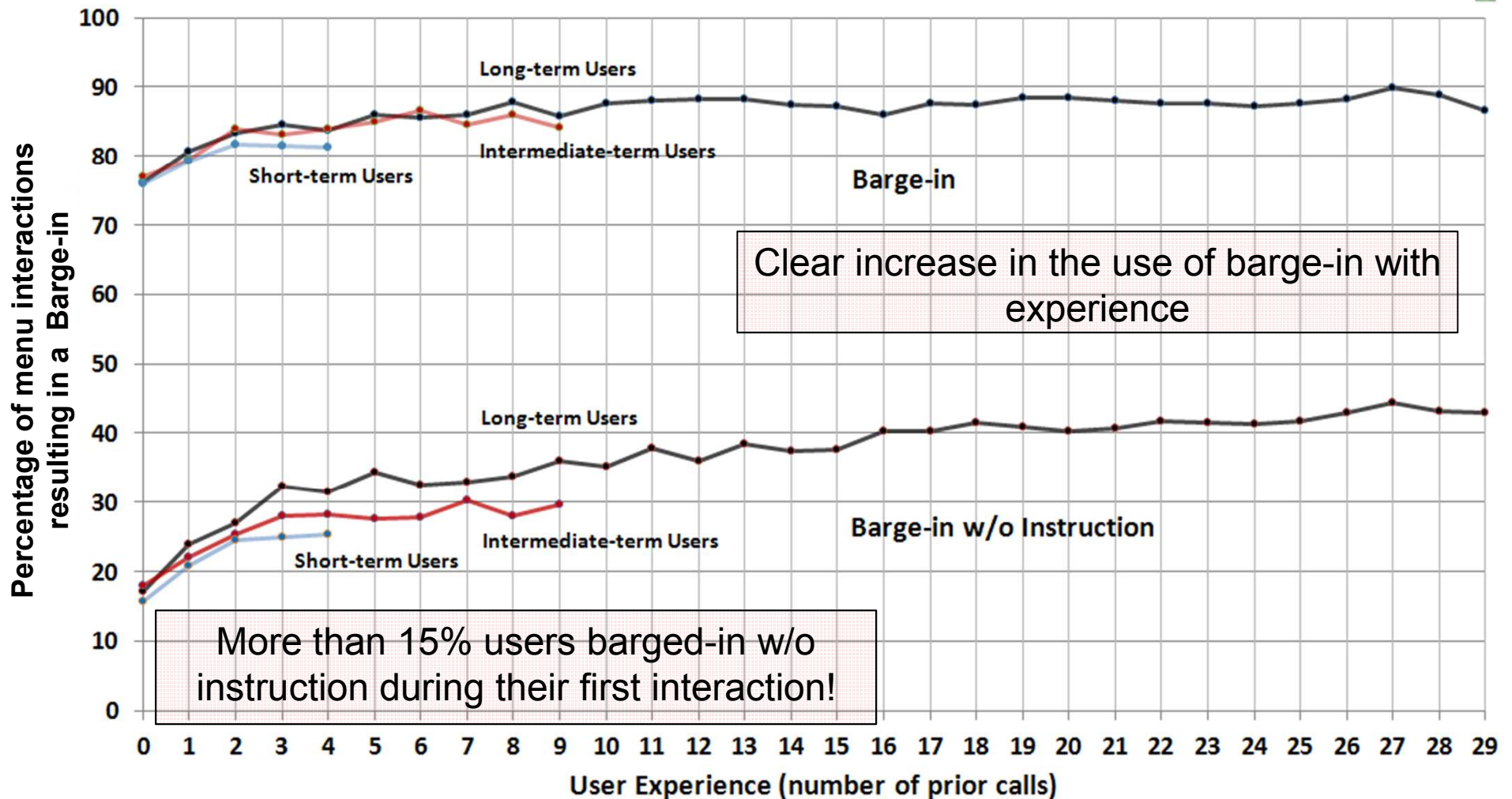
Barge-in Behavior in Main Menu

Barge-in: The user presses a key before the end of the voice prompt

Barge-in w/o Instruction: The user presses a key before the voice menu even instructs him about that option



Barge-in Behavior in Main Menu





Research Question

Reproducibility: Can our setup and results be reproduced in a different country?

The Babajob.com¹, MSRI² Collaboration

(Sean Blagsvedt¹, Maya Chandrasekaran¹, Bill Thies², Indrani Medhi², Spandana Gella², Bhiksha Raj, Rita Singh, Rajat Kulshreshtha)



Babajob.com: A job portal in Bangalore with an active listing of thousands of informal and entry level jobs

Goals

- Make Polly viral in Bangalore
- Advertise Babajob.com to low-literate job seekers through Polly

Setup



- A local phone number in Bangalore receives the “missed calls”
- Polly calls back from the US
- Supports:
 - Kannada (Archana) and Hindi (Rita) voice prompts
 - Call transfer to Babajob.com’s IVR from Polly’s main menu
 - A voice directory of previously-called friends

For almost a year Polly did not take off!

Call traffic did not die out either...

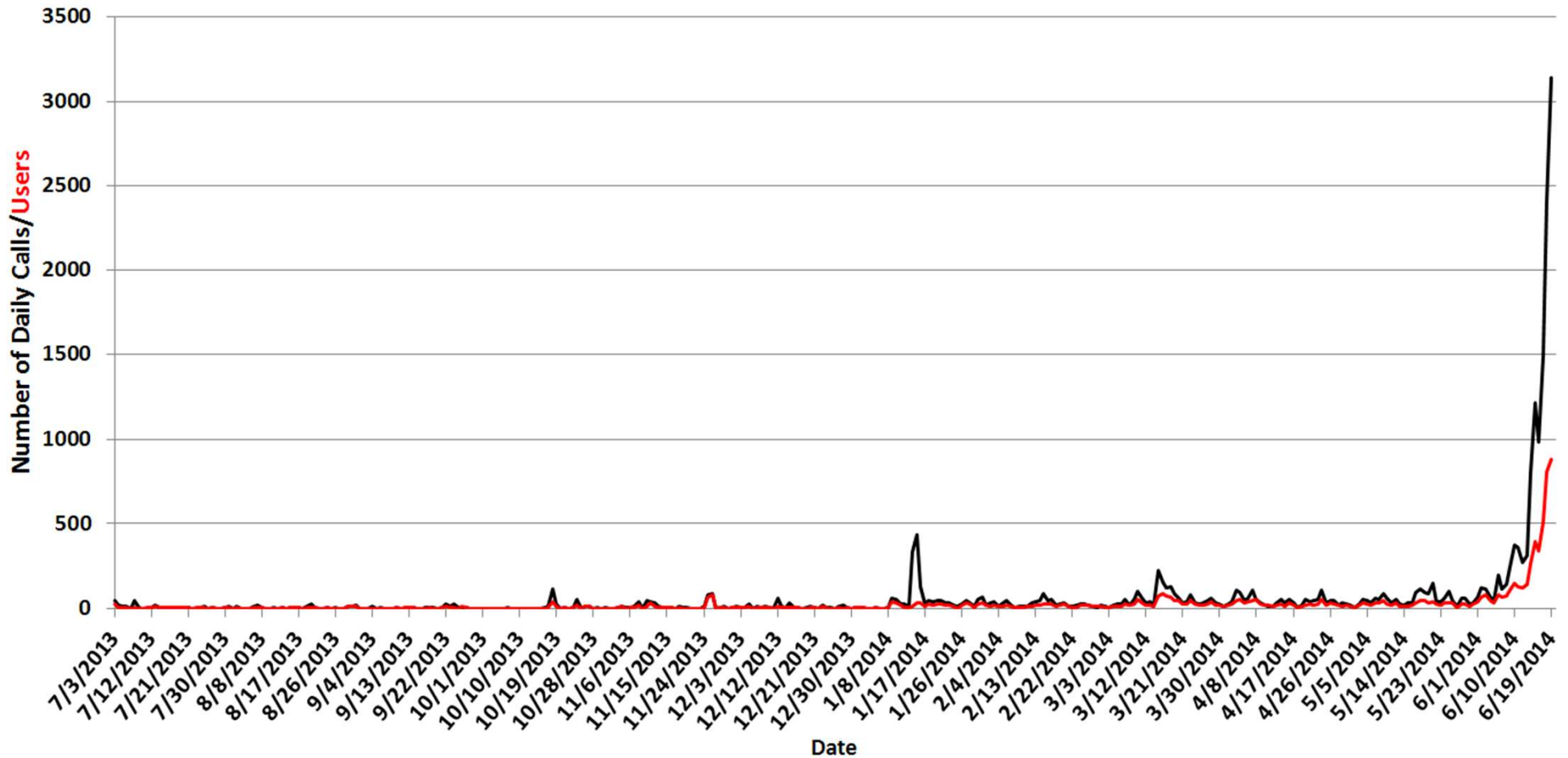
We made two changes to the interface based on user feedback...

and it abruptly became exponential:

- 10,349 calls
- 1,613 users
- 7 days



Phases of Activity



Intro

Viral Ent.

Vehicle

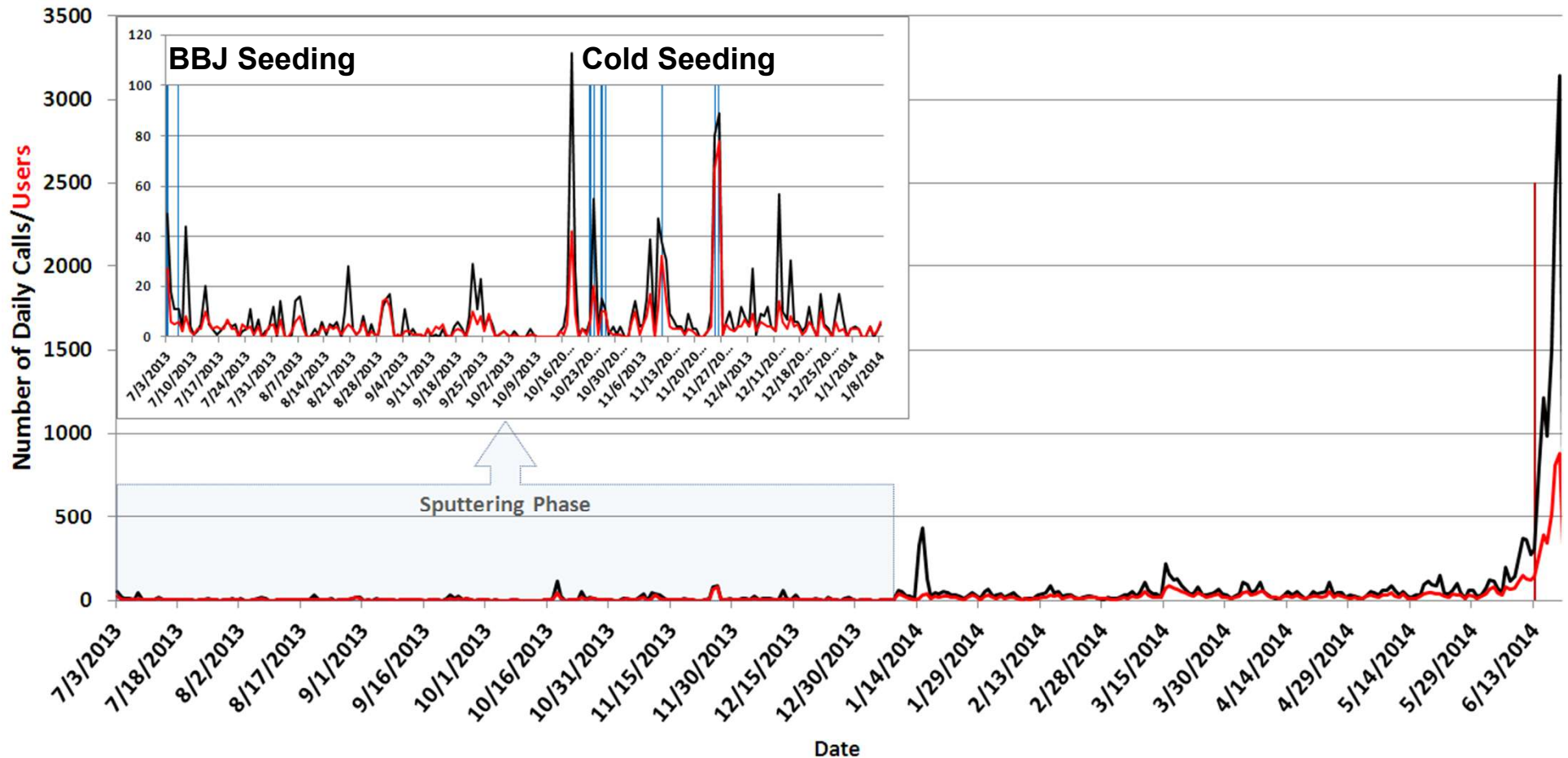
Test-bed

Reproducible

Carnegie Mellon University



Phases of Activity



Fluctuating, intermittent activity

Intro

Viral Ent.

Vehicle

Test-bed

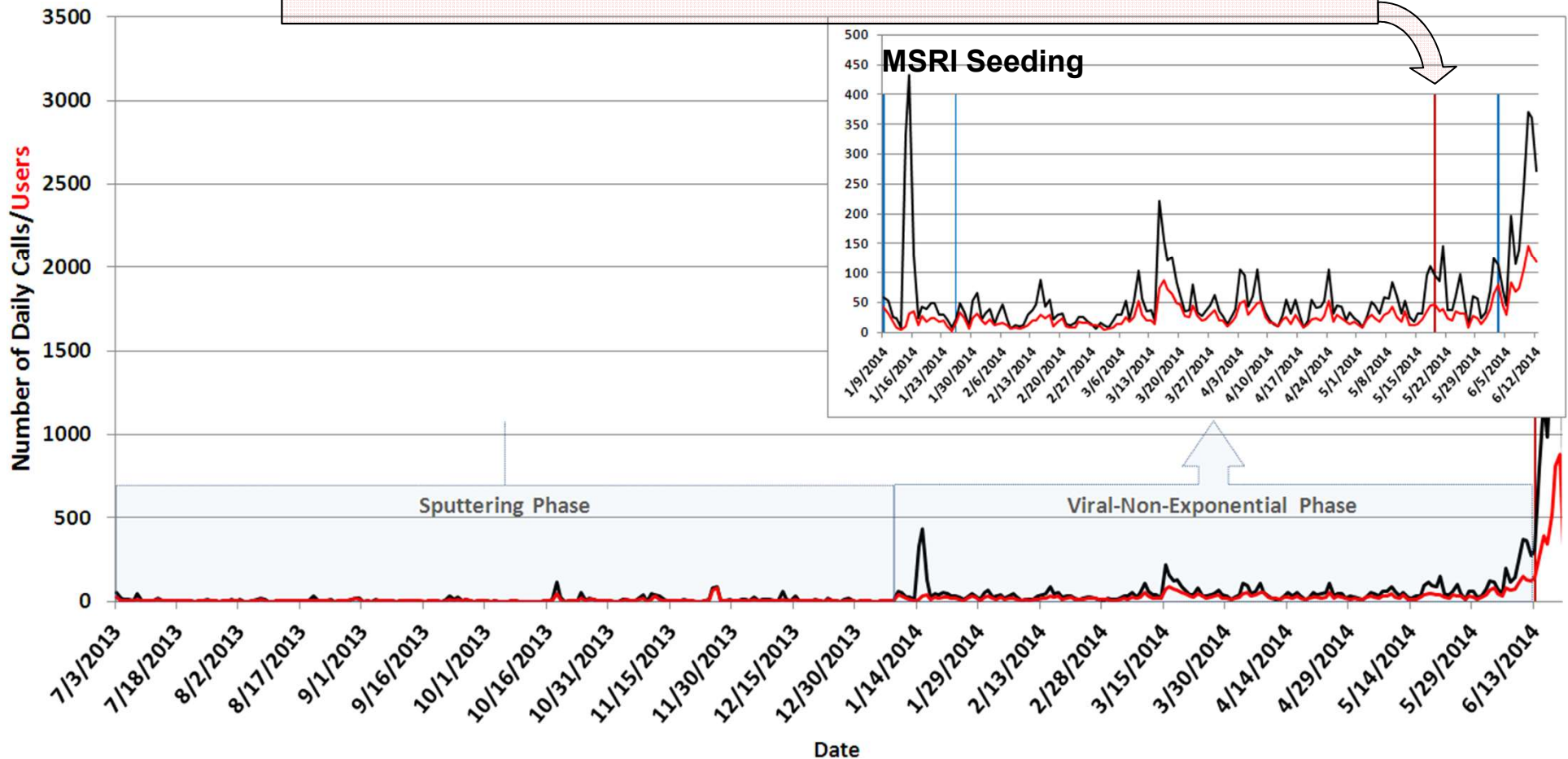
Reproducible

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Phases of Activity

Unadvertised option to send unmodified voice



Sustained transmission but no exponential spread

Intro

Viral Ent.

Vehicle

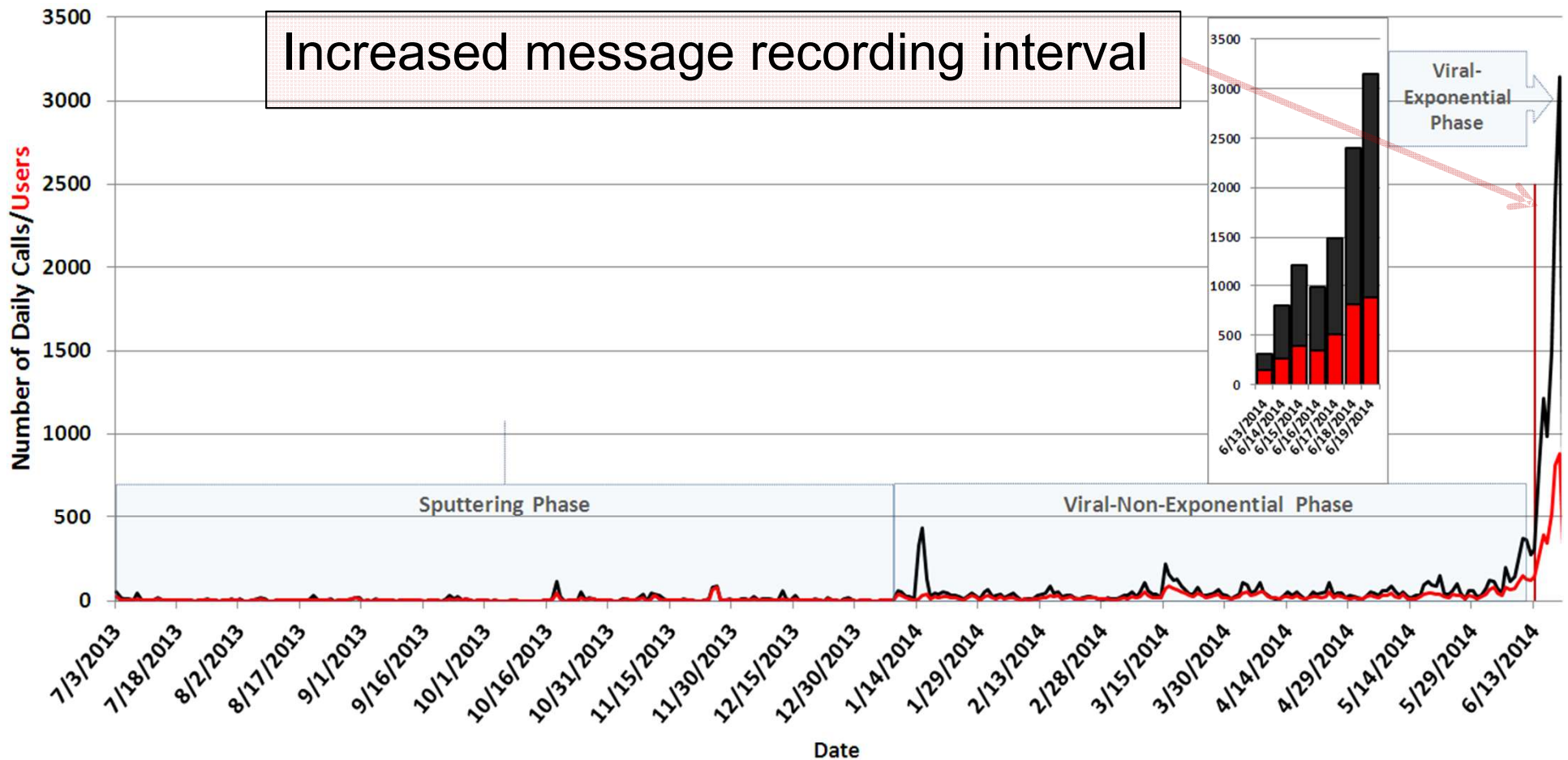
Test-bed

Reproducible

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Phases of Activity



Abrupt exponential spread!

Intro

Viral Ent.

Vehicle

Test-bed

Reproducible

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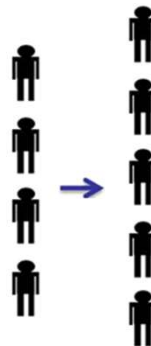


Virality and Exponential Spread

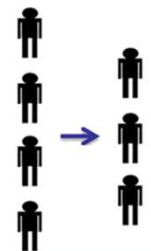
Virality is defined as long, sustained chains of transmission to new users

The **Basic Reproductive Rate** of spread, R_0 , is defined as the expected number of new users introduced by a current user over its lifetime, in a fully susceptible population.

$R_0 > 1$, exponential spread



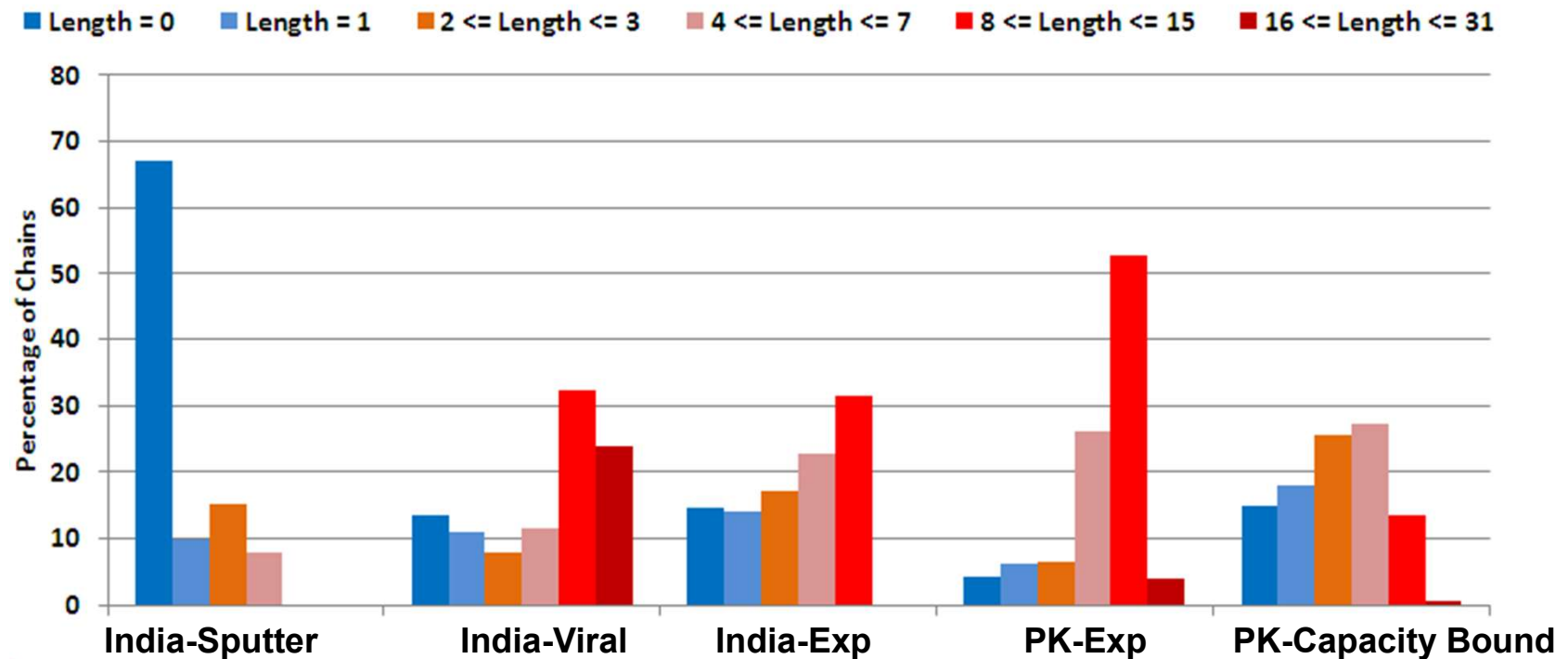
$R_0 < 1$, exponential decay





Virality and Exponential Spread

	India-Sputter	India-Viral	India-Exp	PK-Exp	PK-Capacity Bound
Length of phase	6 months and 6 days	5 months and 4 days	7 days	7 days	1 month 11 days
R_0	0.2	0.7	1.2	1.3	0.7
Avg Chain Length	0.9	9.3	5	8.1	3.7
Max Chain Length	7	26	15	21	23

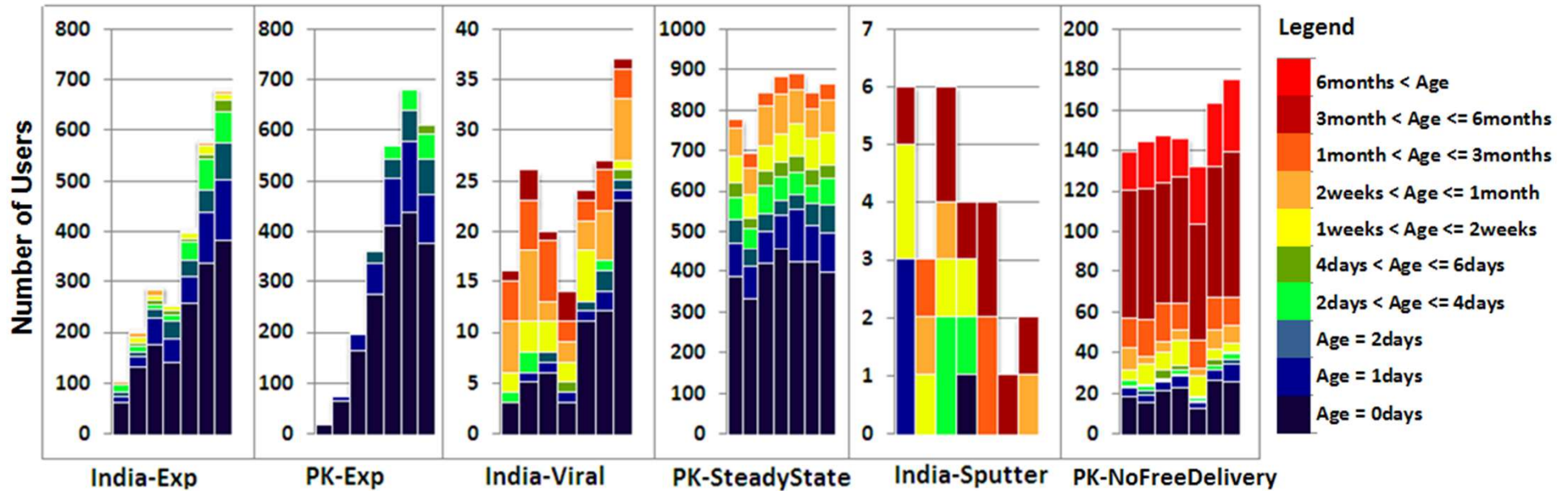




- **During the non-exponential phases:
Why didn't the traffic fizzle?**
- **Why did Polly eventually attain
exponential spread?**
- **Why didn't Polly take-off immediately
in India as it did in Pakistan?**



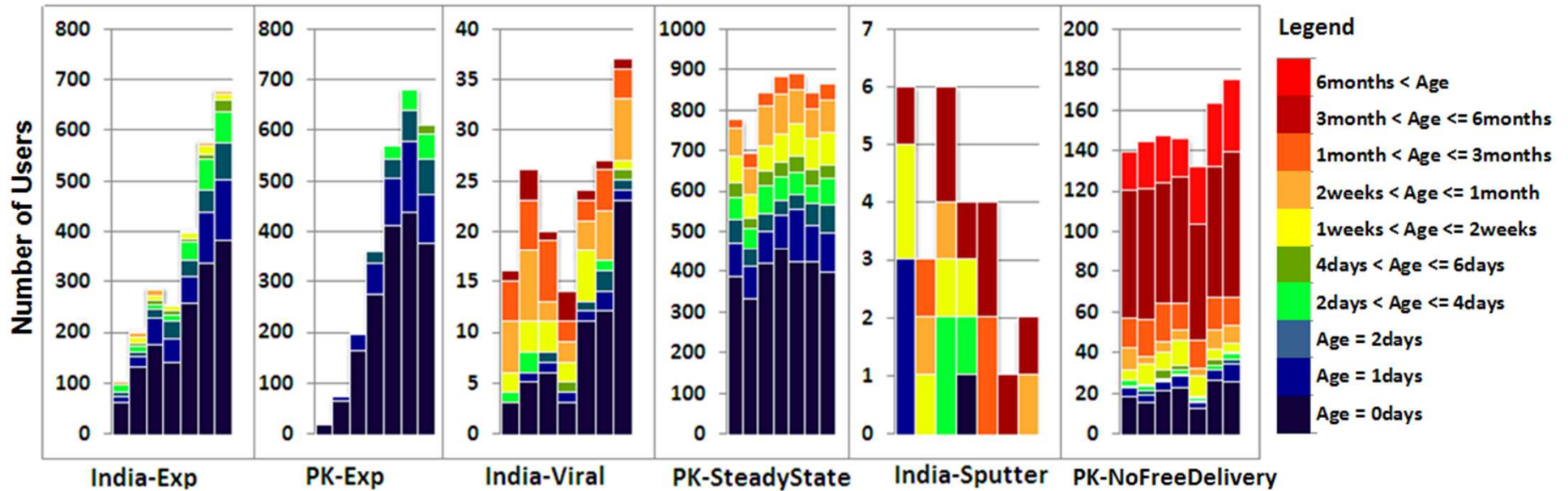
Distribution of Daily Users by their Polly Age



Majority of users are new



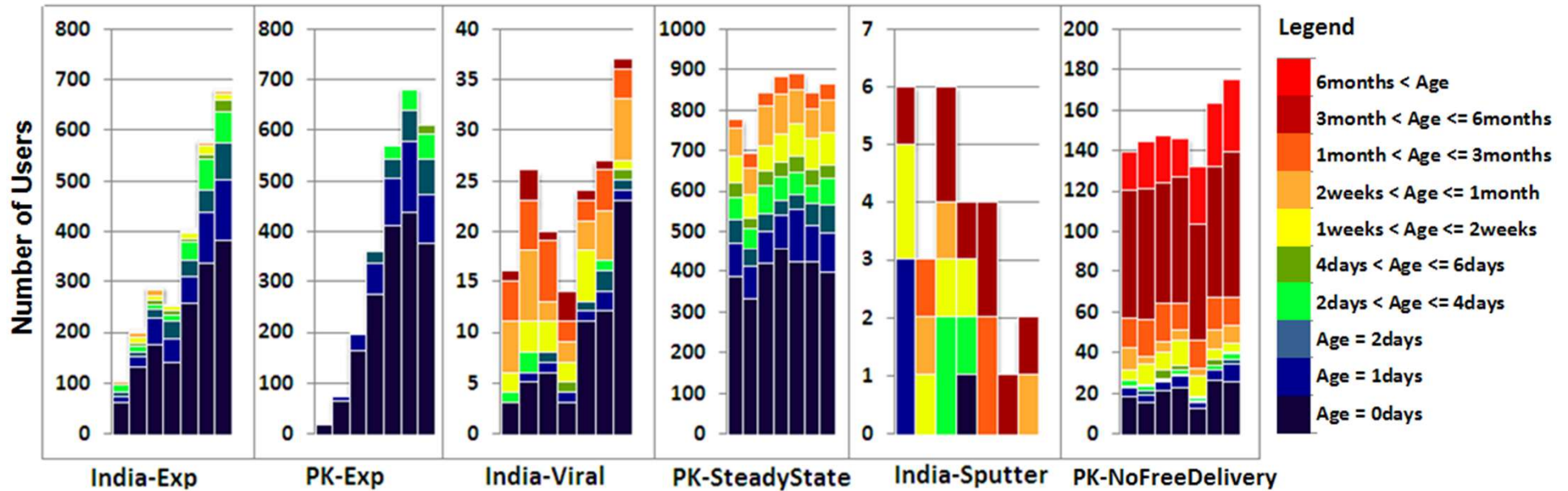
Distribution of Daily Users by their Polly Age



A Significant number of old users



Distribution of Daily Users by their Polly Age



Majority of users are old

Intro

Viral Ent.

Vehicle

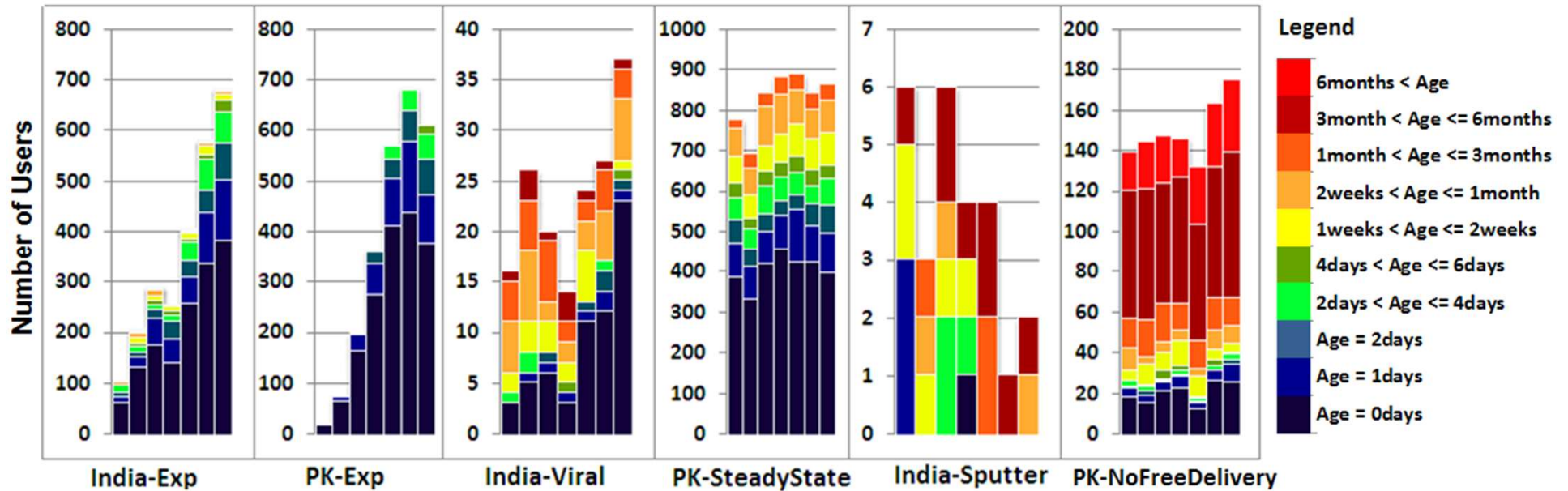
Test-bed

Reproducible

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Distribution of Daily Users by their Polly Age



During non-exponential periods, activity mostly due to Long-term & Utility Oriented users!



- **During the non-exponential phases:
Why didn't the traffic fizzle?**
- **Why did Polly eventually attain
exponential spread?**
- **Why didn't Polly take-off immediately
in India as it did in Pakistan?**



User Requests

(from 87 survey calls during the viral-non exponential phase)

- **Send messages without modifying the voice: 55%**
- **Increase message recording interval: 32%**
- **Make Polly available in Bangla:19%**
- Improve Job ads service: 32%
- Improve audio quality: 22%

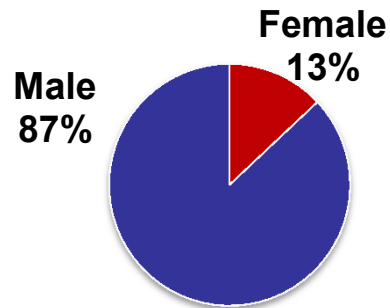
Also learned from the surveys:

- Although seeded with undergraduate students, Polly was largely being used by low-SES users!
- Used by a group of blind users at a training institute.

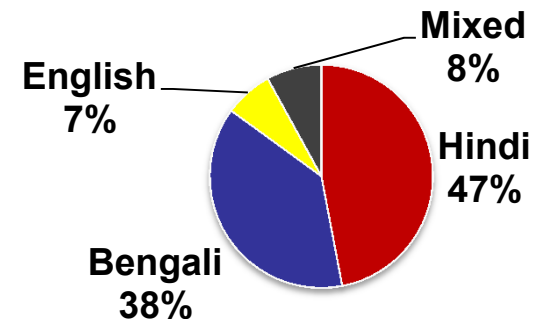


User Feedback through Polly

Gender (based on 419 recordings)



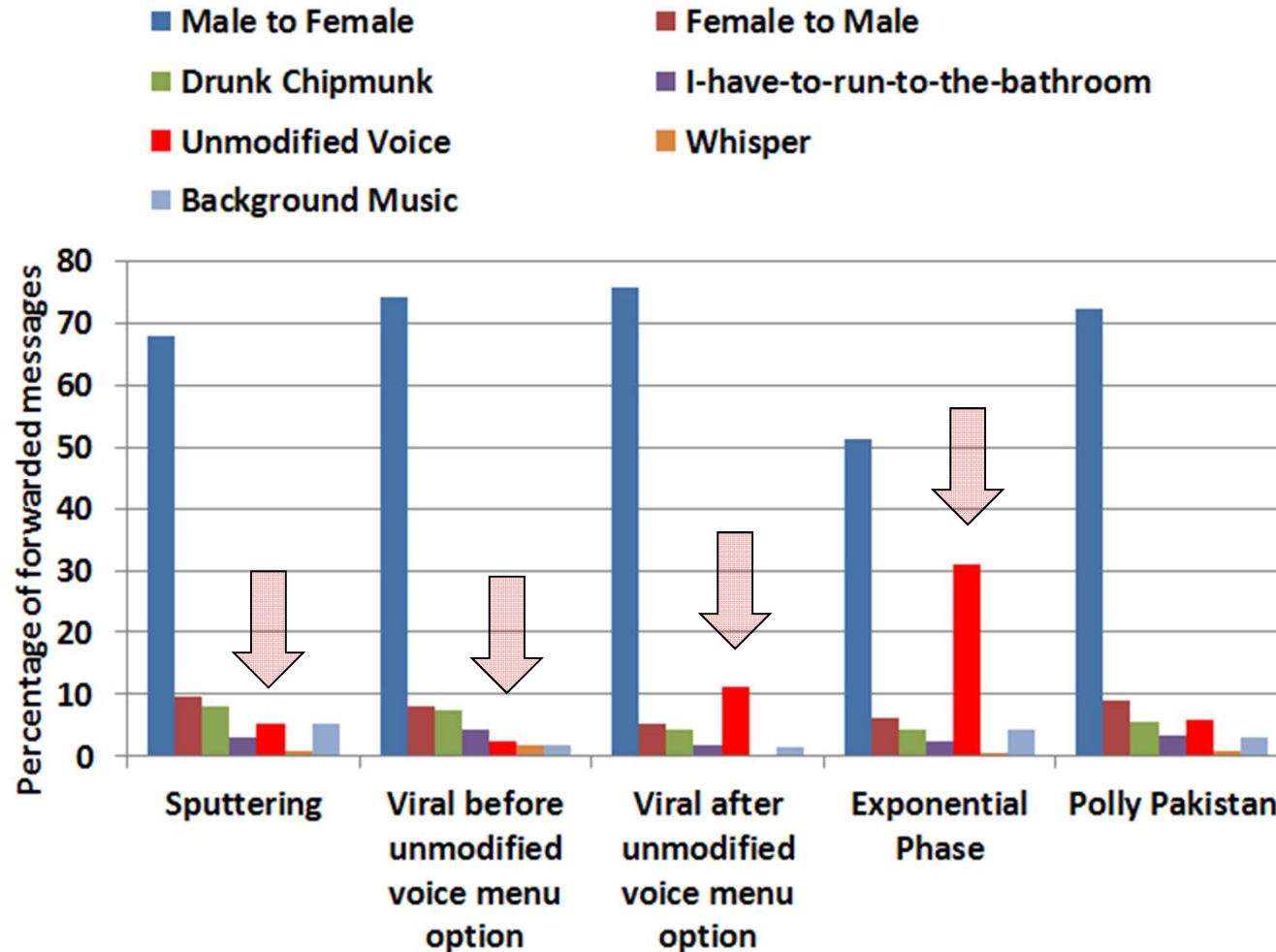
Language (based on 376 recordings)



Complaints & Suggestions (based on 82 recordings)

- **Send messages without modifying the voice: 22%**
- **Increase message recording interval: 18%**
- **Other voice messaging features: 21%**
- **Make Polly available in Bangla: 16%**
- Job service related feedback: 6%
- Improve audio quality: 21%
- Keys not being recognized correctly: 10%
- More voice modifications: 9%

Choice of Voice Modifications



The use of unmodified voice increased significantly after the menu option and increased recording interval.



Q: Why did Polly eventually attain exponential spread?

A: Because we modified it to match users' needs:

- Users in India were more interested in voice messaging as compared to voice modifications
 - Explicit option to send unmodified voice messages
 - Increased recording interval



- **During the non-exponential phases:
Why didn't the traffic fizzle?**
- **Why did Polly eventually attain
exponential spread?**
- **Why didn't Polly take-off immediately
in India as it did in Pakistan?**



Hypothesized Explanation

- Initial seeding attempts proved ineffective
- Initial voice prompts were inappropriate
- In India users were:
 - more interested in voice messaging
 - exposed to more voice spam and frauds