### **Mobile Energy**

## Special Topics in Mobile Systems (FC5260)

Instructor: Venkat Padmanabhan

Note: includes slides generously made available by the authors of the papers being discussed

### This Lecture: Energy

- Papers to be critiqued:
  - "An Analysis of Power Consumption in a Smartphone", Usenix ATC 2010
  - "Fine Grained Energy Accounting on Smartphones with Eprof", EuroSys 2012
- Other papers to read:
  - "Carat: Collaborative Energy Debugging for Mobile Devices", Usenix HotDep 2012
  - "Who Killed My Battery: Analyzing Mobile Browser Energy Consumption", WWW 2012

### **Top-Down View**

Apps (Carat)

Modules (Browser)

Subroutines (E-Prof)

**Hardware Components** 





### An Analysis of Power Consumption in a Smartphone

Aaron Carroll and Gernot Heiser



Australian Government

Department of Broadband, Communications and the Digital Economy

Australian Research Council



























#### Problem



- Where and how is power consumed in a smartphone?
- Approach: fine-grained instrumentation of a real device



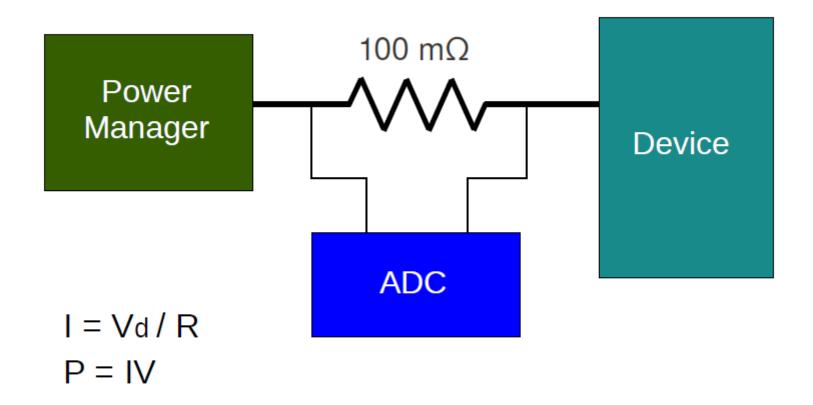


#### OpenMoko Freerunner

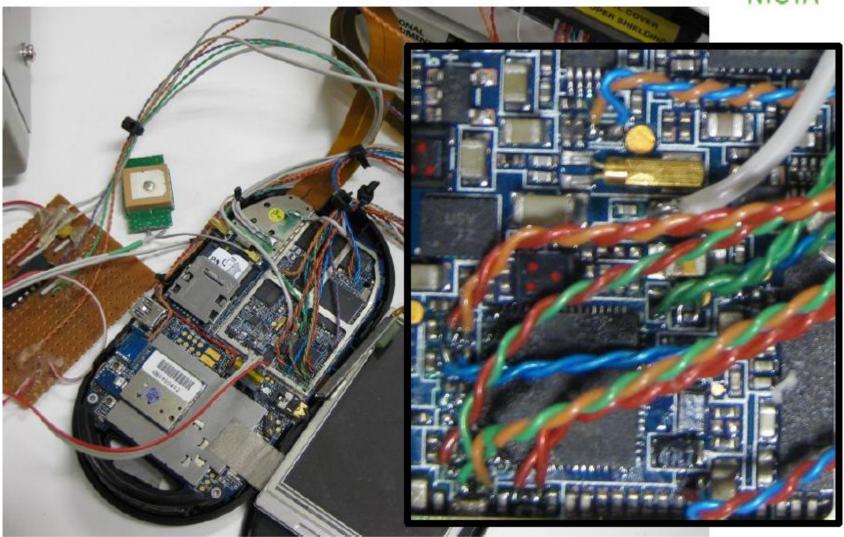
- 2.5G smartphone, c. 2008
- 400 MHz ARM9
- Lacking camera, 3G modem
- Open design
- Amenable to power instrumentation

om imagination to impact











#### Instrumented components

- CPU
- RAM
- GSM
- GPS
- Bluetooth
- LCD panel

- WiFi
- Backlight
- Audio codec
- Amplifier
- NAND flash
- SD card

#### Benchmarks



#### Micro-benchmarks

Suspend - Flash storage

- Idle - Network

Backlight - GPS

- CPU/RAM

#### Usage scenarios

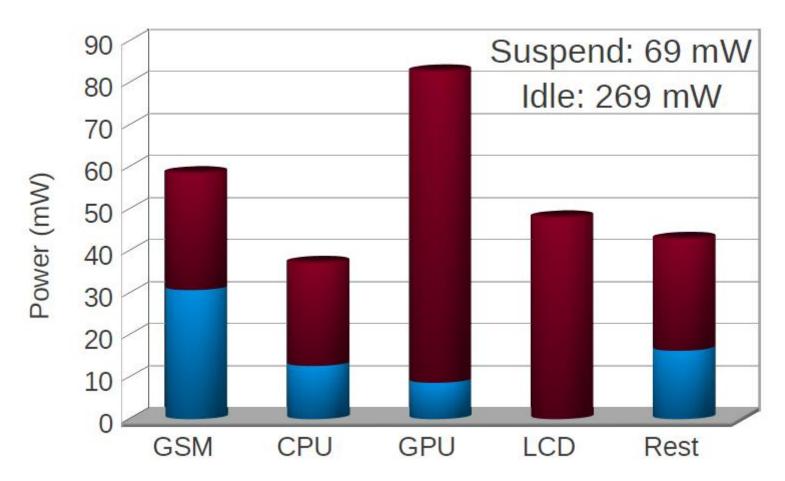
- Audio - Email

VideoWeb

- SMS - Call

#### Idle Power



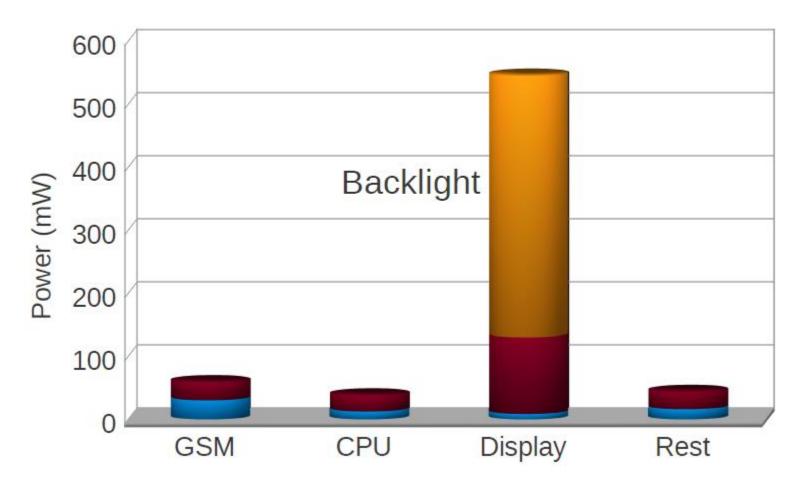


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From imagination to impact

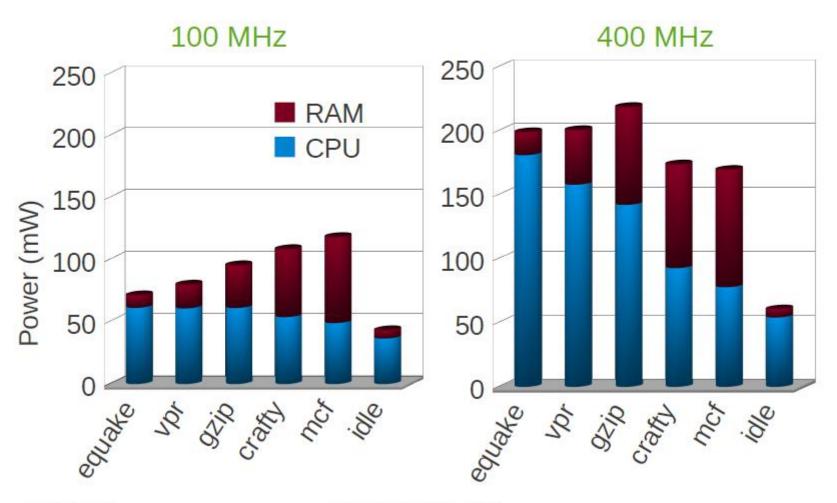
#### Display Power





#### CPU and RAM



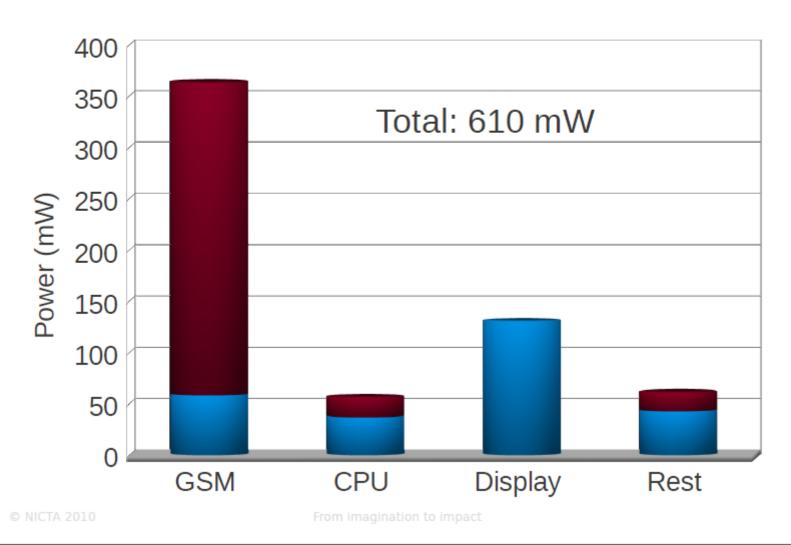


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From imagination to Impact

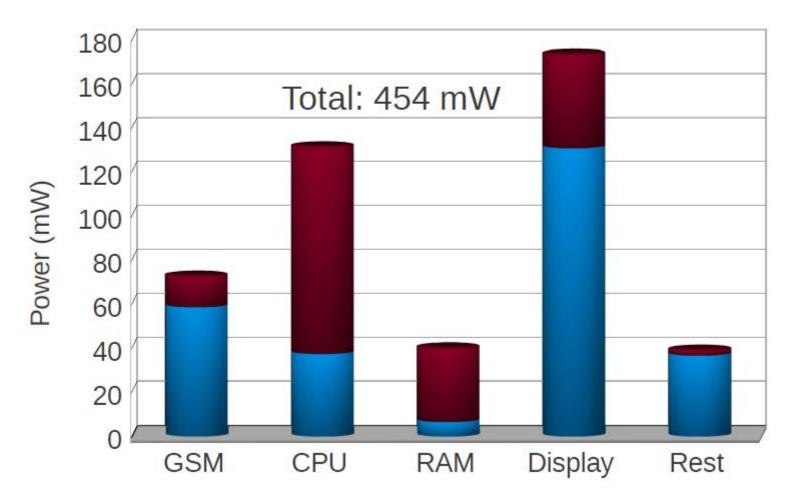
#### **Email**





#### Video





NIC (A 2010)

From imagination to impact

#### Validation



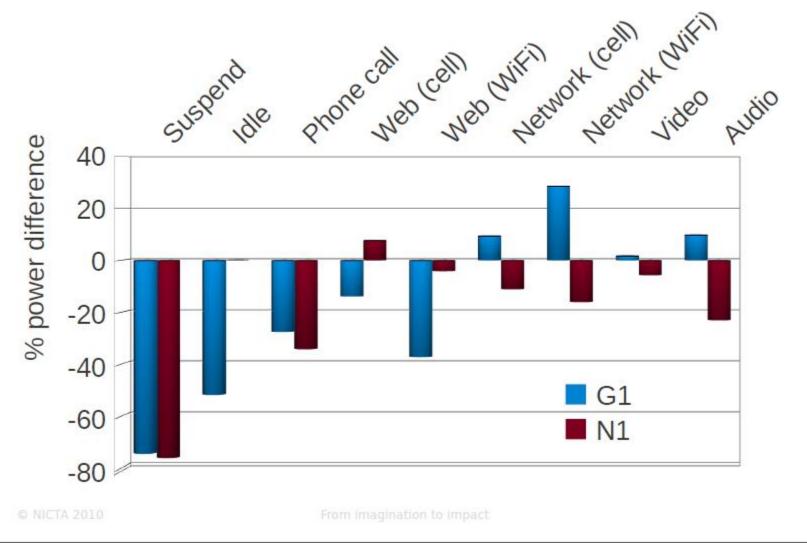
- Benchmarks repeated on two devices:
  - HTC Dream (G1)
  - Google Nexus One (N1)
- Total system power only
- 3-4 years of mobile technology





#### Validation





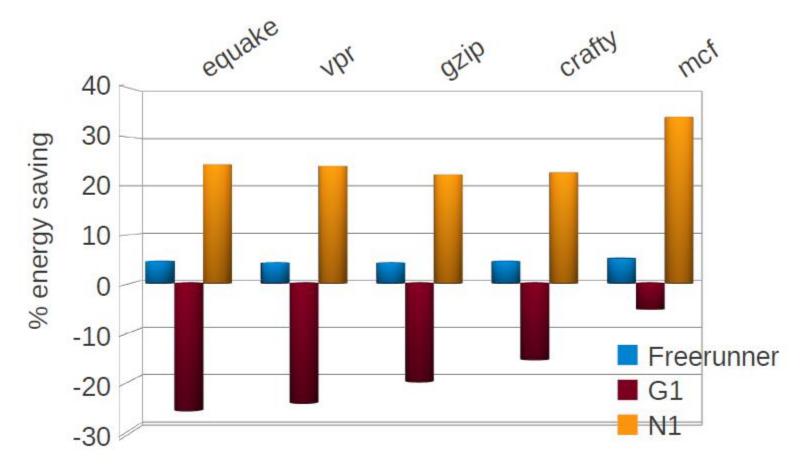
#### **DVFS**



- Dynamic Voltage and Frequency Scaling
- DVFS reduces power
  - ... but does it reduce energy?

#### **DVFS**





D NICIA 2010

From imagination to impact

#### Conclusions



- Major consumers: display & cell radio
  - WiFi power low in most situations
- CPU can be significant
  - Future power driver
- Where power is **not** going:
  - RAM
  - Audio
  - Bluetooth
  - Storage

#### Conclusions



- Both dynamic and static power important
- DVFS hanging on (for now)
- Networking power not increasing

## Where is the Energy Spent Inside My App? Fine Grained Energy Accounting on Smartphones with eprof

Abhinav Pathak Y. Charlie Hu



Ming Zhang

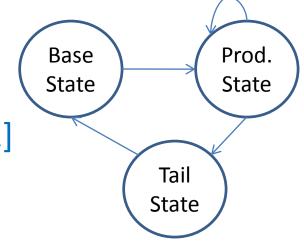
Microsoft Research

# Tracking Power Activities Power Modeling

- State-of-art 'utilization based' power models are inaccurate on smartphones
  - Only active utilization => power consumption
  - Energy is consumed linearly w.r.t utilization

Hard to map power triggers to fine grained app activities

- System call triggered FSM based fine-grained power model [Eurosys '11]
  - Use system calls as power triggers
  - System calls drive Finite-State-Machine



### **Tracking App Activities**

Granularity of Energy Accounting

**Multi Threading:** 







**Third Party Ad Module** 



**Multi Processing:** 











**Multiple Routines:** 

Collect information
Upload information
Download ads 24

### **Tracking App Activities**

- Granularity of Energy Accounting
  - eprof supports per Process/Thread/Routine granularity
- I/O Devices
  - Track system call to program entity
    - Process getpid()
    - Thread gettid()
    - Routine backtrace()
- CPU
  - Just like gprof [PLDI '82]
  - Periodic sampling of routine call stack

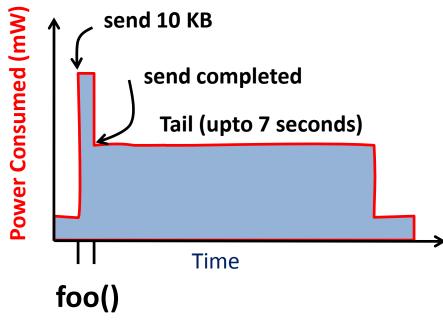
# Lingering Energy Consumption (a) Tail Energy

Effect on power/energy consumed by a component because of an activity lasts beyond the end of the activity



**Components with tail:** 

Sdcard 3G WiFi GPS



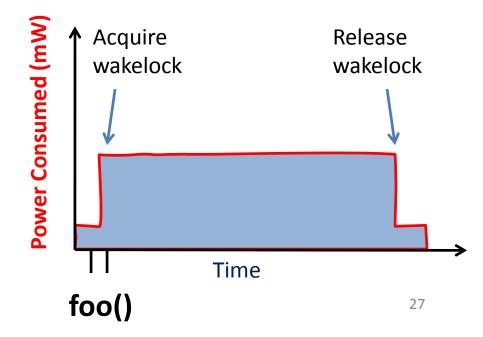
## Lingering Energy Consumption (b) Persistent State Wakelock

- Aggressive Sleeping Policies: Smartphone OSes freeze system after brief inactivity
- Power <u>encumbered</u> Programming: Programmer has to manage sleep/wake cycle of components

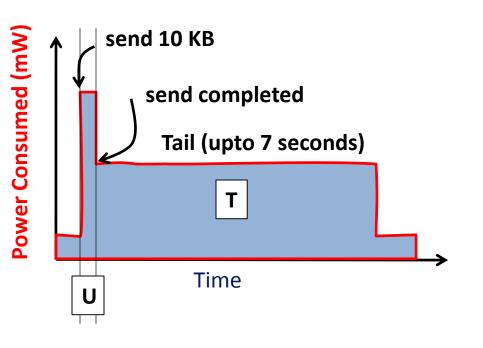


Keep the screen on!

Lucia Ferne

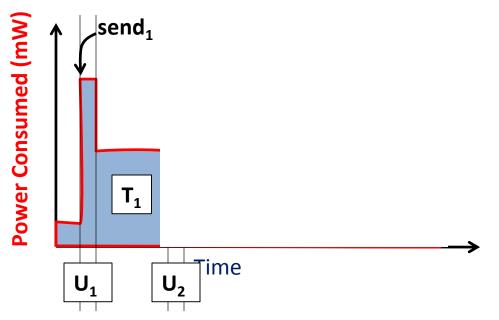


## Lingering Energy Consumption Case 1: Single Call Single Tail



- 1. Energy represented in terms of an energy tuple (U, T)
- 2. (U, T) is attributed to entity (s) containing send system call

# Lingering Energy Consumption Case 2: Multiple Calls Multiple Tails

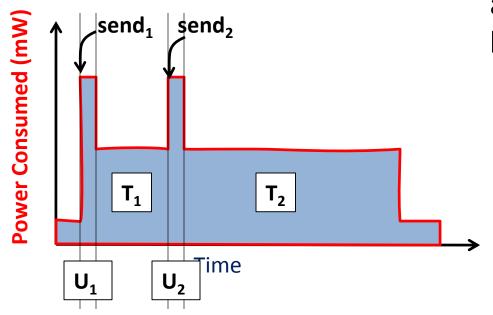


How to split tail T<sub>2</sub> among?

Average Policy: Split tail energy T<sub>2</sub> in weighted ratio

- 1. Not easy to define weights
- Policy gets complicated in presence of multiple system calls

# Lingering Energy Consumption Case 2: Multiple Calls Multiple Tails



Last-Trigger-Policy: Assign asynchronous (tail) energy to the last active system call

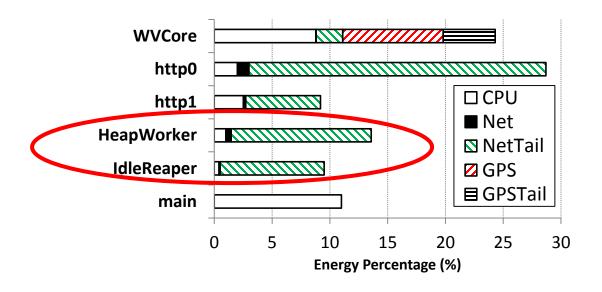
```
send_1 : (U_1, T_1)
send_2 : (U_2, T_2)
```

- 1. Not easy to define weights
- 2. Policy gets complicated in presence of multiple system calls

## eprof System (Android and Windows Mobile)

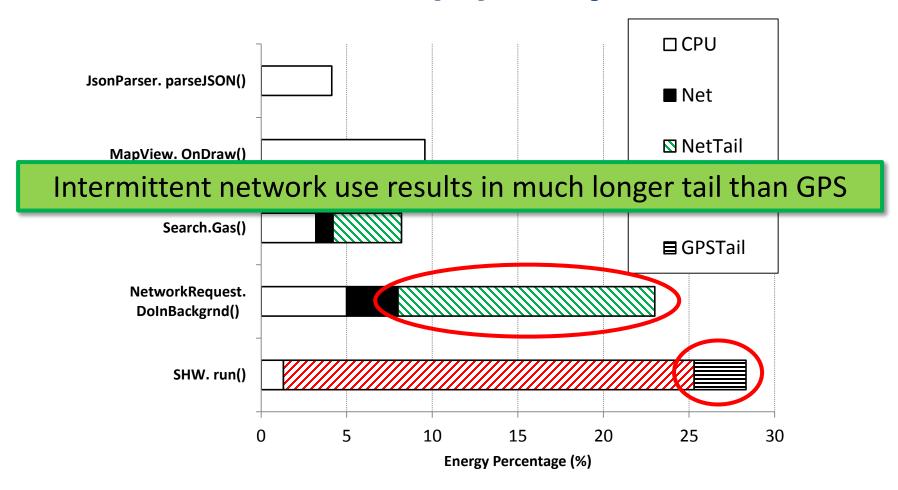
Logging Overhead: 2-15% Run Time, 1-13% Run Energy

# Case Studies: (a) Android Browser Google Search

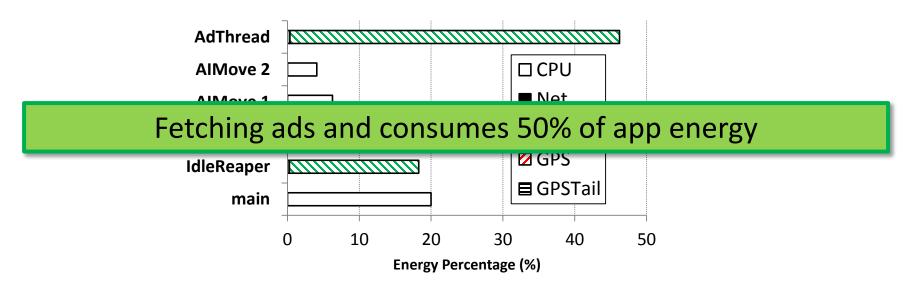


Activity	Energy %
HTTP	38%
TCP Conditioning	25%
User Tracking	16%
GUI Rendering	5%

### Case Studies: (b) Map Quest

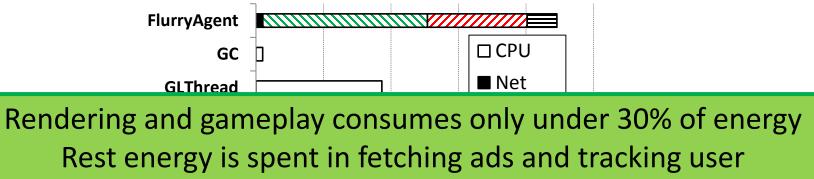


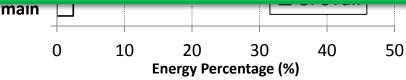
## Case Studies: (c) Free Chess



Activity	Energy %
Advertisement	50%
GUI Rendering	20%
Al	20%
Screen Touch Events	2%

### Case Studies: (d) Angry Birds



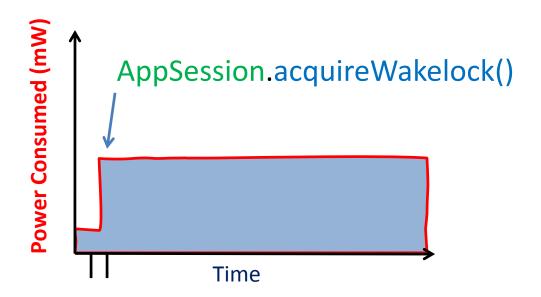


Activity	Energy %
User Tracking	45%
TCP Conditioning	28%
Game Rendering	20%

## Case Studies (e): Facebook Wakelock Bug

**Google Nexus (WiFi)** 

FaceBookService: 25%

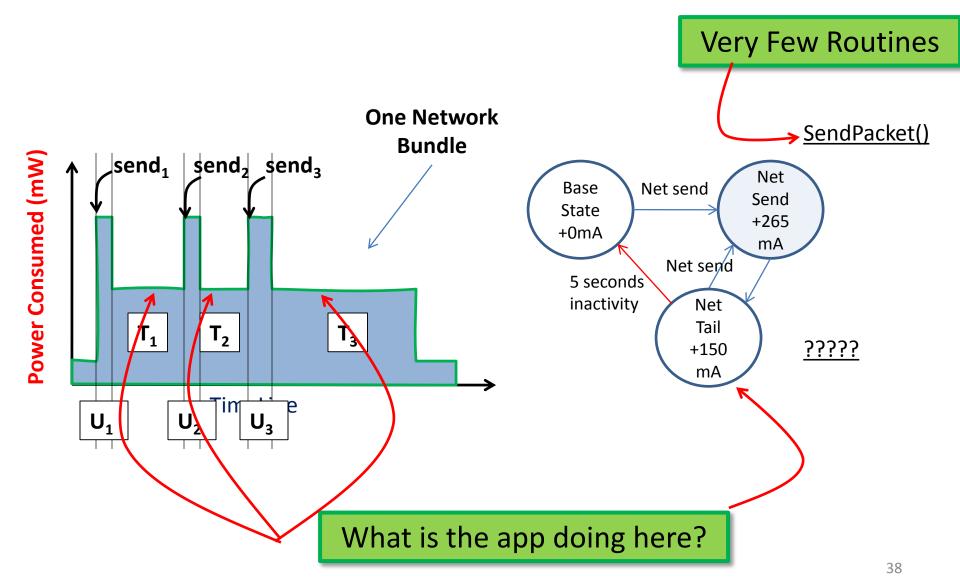




# **App Energy Drain Characteristics**

- IO consumes the most energy
  - Most apps spent 50% 90% of their energy in IO
  - A linear energy presentation does not help with debugging
     IO Energy
- gnergy is spent in bursts, called bundles A bundle is d hed a continuous riod 🕍 5ower Consumed (mW) comp ent a vely ısum ener ∜ery dles app 20 0 Browser AngryBirds Fchess NYTimes Mapquest Photo Upload 37 **IO Energy Bundles**

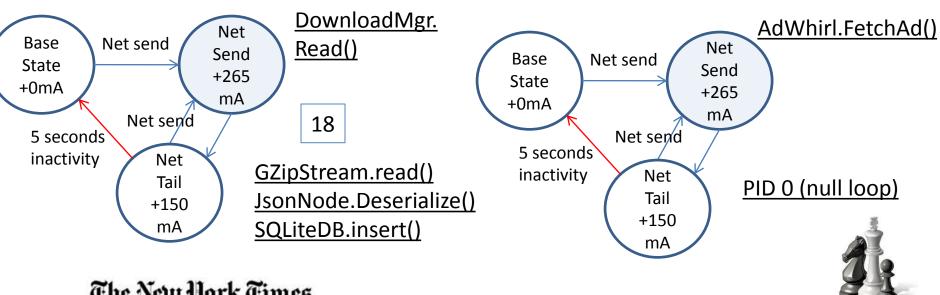
# **IO Bundle Representation**



## **Optimizing IO Energy using Bundles**

### Why is a bundle so long?

### Why are there so many bundles?



The New Hork Times

Reduced energy consumption of 4 apps by 20-65% by minimizing number of bundles and reducing bundle lengths

### Conclusion

- eprof: fine-grained energy profiler
  - Enables opportunities for in-depth study of app energy consumption
- Case studies of popular apps energy consumption
  - 65-75% of app energy spent in tracking user and fetching ads (for example, angrybirds)
- Bundles: IO energy representation
  - Helps debugging smartphone app energy

# **Top-Down View**

Apps (Carat)

Modules (Browser)

Subroutines (E-Prof)

Hardware Components





## Who Killed My Battery: **Analyzing Mobile Browser Energy Consumption**

Narendran Thiagarajan<sup>1</sup>, Gaurav Aggarwal<sup>1</sup>, Angela Nicoara<sup>2</sup> Dan Boneh<sup>1</sup>, Jatinder Pal Singh<sup>3</sup>

<sup>1</sup>Department of Computer Science, Stanford University, CA <sup>2</sup>Deutsche Telekom Innovation Labs, Silicon Valley Innovation Center, CA <sup>3</sup>Department of Electrical Engineering, Stanford University, CA

April 18, 2012

### A Software Infrastructure for Measuring the Precise Energy Used by a Mobile Browser

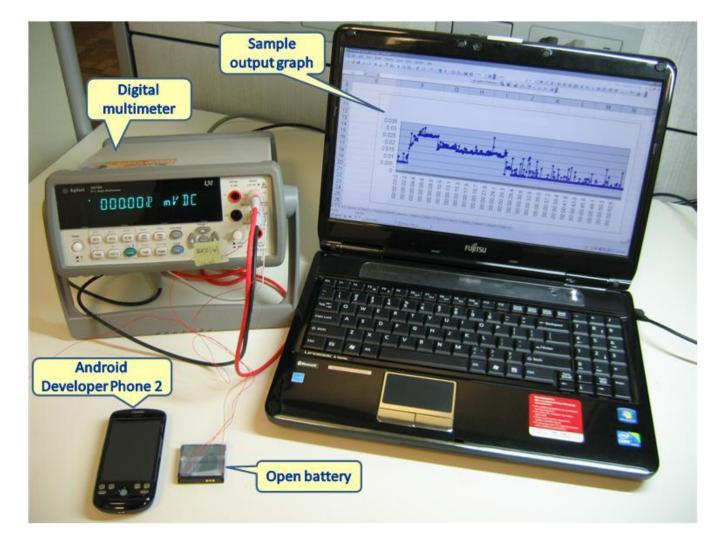
Challenge: How much energy does the phone use to render a particular web page?

Impact of the structure of web pages on battery usage in phone browser?

How to design web pages to minimize the energy needed for rendering?



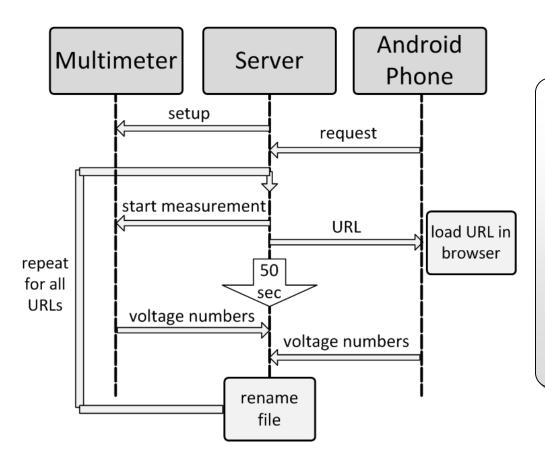
### **Automated Energy Measurement System**







### **Automated Energy Measurement System**

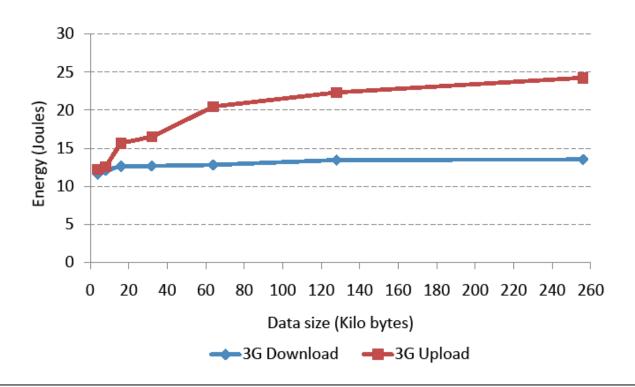


Server controls the phone and multimeter:

- Server communicates with the Browser Profiler app on the phone
- Server instructs the Browser Profiler app to request the running phone browser to repeatedly load a specific URL, either with or without caching
- **3** Server starts the multimeter measurement
- 4 All measurements recorded on the multimeter are transferred to the server for processing



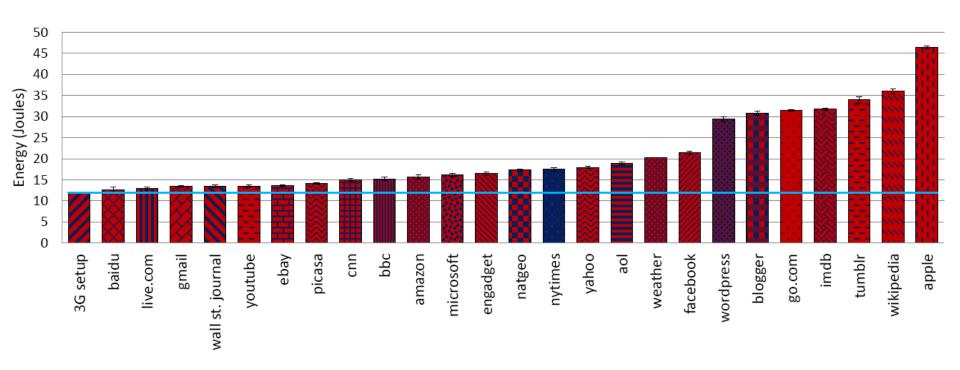
### Energy for Download & Upload Data over 3G



- > Average energy needed for downloading & uploading 4kB to 256kB over 3G
- > Setup cost of roughly 12 Joules before the first byte can be sent
- Download energy mostly flat (up to 256kB)
- Upload energy increases with the amount of data being uploaded



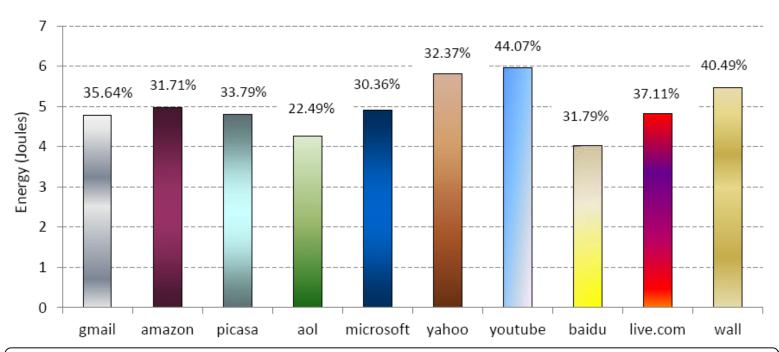
### **Energy Consumption of Top Web Sites**



- > Energy to download and render the web page (energy for 3G communication + parsing + rendering web page)
- ➤ Average power consumption when the browser is idle ⇒ 170 mW



### Rendering Energy Consumption of Top Web Sites

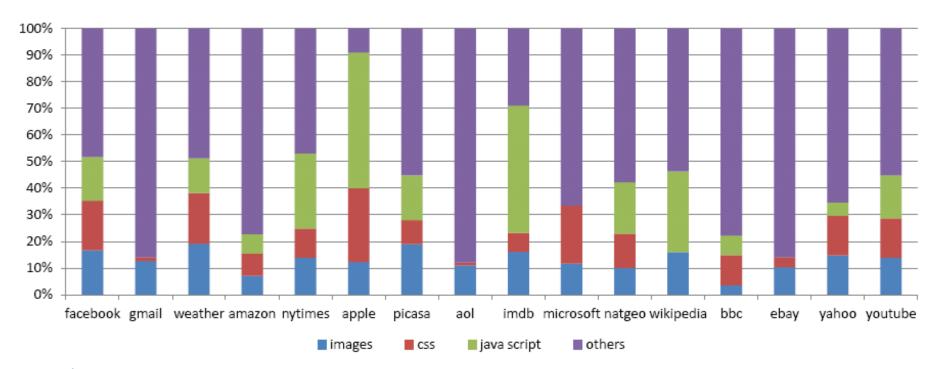


- > Energy needed to parse and render the page (no energy for 3G communication)
- > Energy used to render the content from local cache
- > How the complexity of the web page affects the energy needed to render it
- Dynamic Javascript can greatly increase the power usage of a web page

Challenge: How much energy is used by different web elements?



## **Energy Consumption of Web Components** (Transmission + Rendering)



### **Evaluation:**

> Relative energy costs of individual web components

### > Results:

- CSS and Javascript most energy consuming components in the transmission and rendering of a web site
- "Others" mainly includes the 3G connection setup and text rendering



### Optimizing Mobile Web Pages

#### Reducing Javascript Power Consumption

- Javascript one of the most energy consuming components in a web page
- > Optimizations:
  - ✓ Shrinking Javascript on a mobile page to contain only functions used by the page greatly reduces energy cost

### Reducing CSS Power Consumption

- > Large CSS files with unused CSS rules consume more then minimum required energy
- > Optimizations:
  - CSS should be web page specific and contain only the rules required by the elements in the web page



# Guidelines for Designing Energy-Efficient Web Sites

- > JPEG is the best image format for the Android browser and holds for all image sizes
- Using HTML links instead of Javascript greatly reduces the rendering energy for the page
- Using links to third party tools can greatly increase the power usage of a phone
- ➤ Using simple HTML table element to position elements on the page instead of CSS saves energy
- Building a mobile site optimized for mobile devices conserves energy
- Guidelines also produce a faster UX and reduced data consumption



# Carat: Collaborative Energy Diagnosis on Mobile Devices



Adam J. Oliner, Anand P. Iyer, and Ion Stoica

AMP Lab, UC Berkeley

Eemil Lagerspetz, Sasu Tarkoma

U of Helsinki





### **Users' Dilemma**



- Users love to use myriad apps
- But they hate it when their battery drains fast
- They then wonder:
  - Why is my battery draining? (hog)
  - Is that normal? (bug)
  - What can I do about it? (action)

# **Prior Approaches**

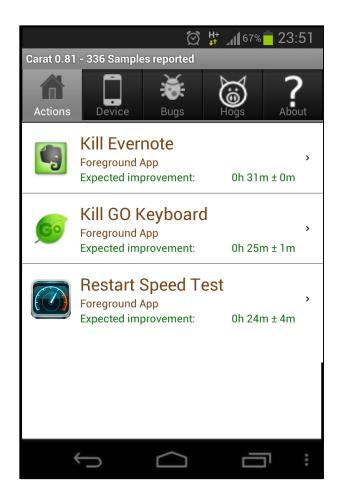
- Focus on specific issues
  - e.g., no-sleep bug
- Intrusive
  - e.g., instrumentation (software or harware)
- Sledgehammer
  - "Kill all background apps"
  - "Dim the screen"
- Goal: a generic, software-only approach that doesn't require any hardware or OS mods

# **Collaborative Diagnostics**

- Idea: use statistics to diagnose problems
- Assumption:
  - mass => norm
  - significant departure from mass => anomaly
- Previously used for a variety of problems:
  - Windows registry issues (STRIDER, 2003)
  - WiFi diagnostics (WiFiProfiler, 2006)
  - Home network diagnostics (NetPrints, 2009)
- Questions:
  - Which metrics to measure?
  - How to gather data from a population?
  - How to compare to identify anomalies?

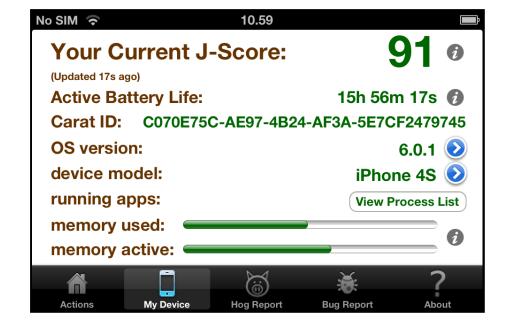
# Why Collaborative?

- Enables diagnosis
  - Nearly impossible on a single device
  - Normal? Trigger? Severity? Frequency?
- Distribute instrumentation overhead
- Compensate for biases and uncertainty

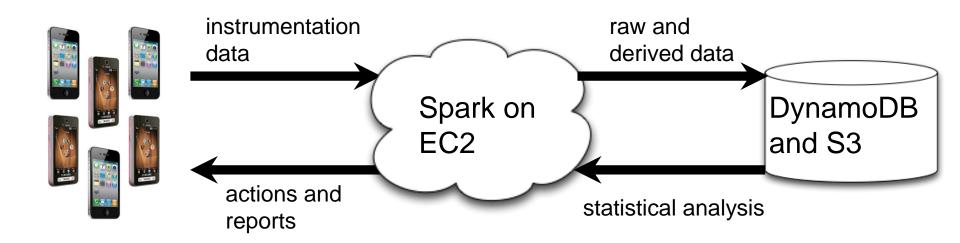








the the big crowd cloud data



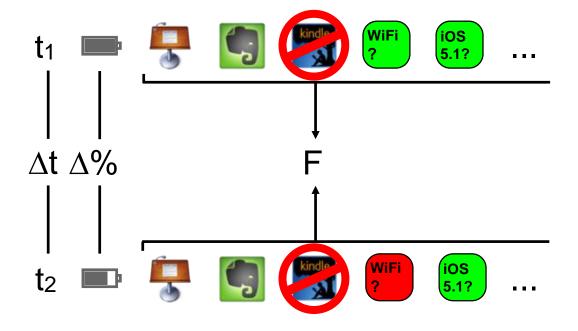
### **Carat Infrastructure**

# **Carat Sampling**



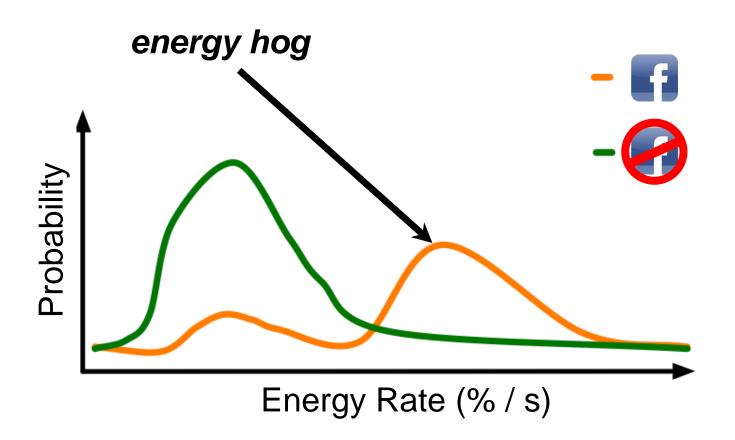


# **Computing Rates**



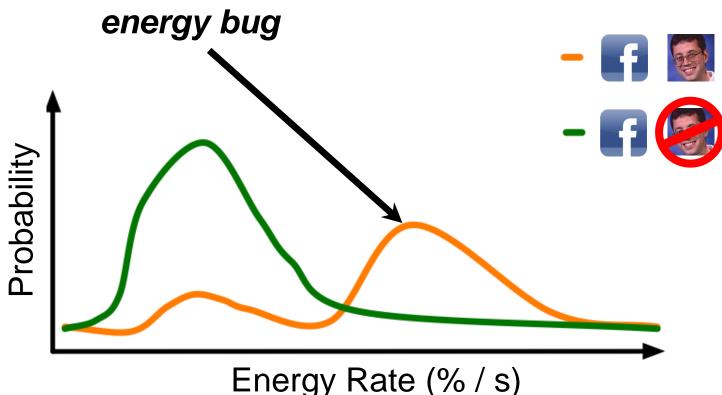
$$\frac{\Delta\%}{\Delta t}$$
 = discharge rate (%/s)| F

# **Energy Anomalies**



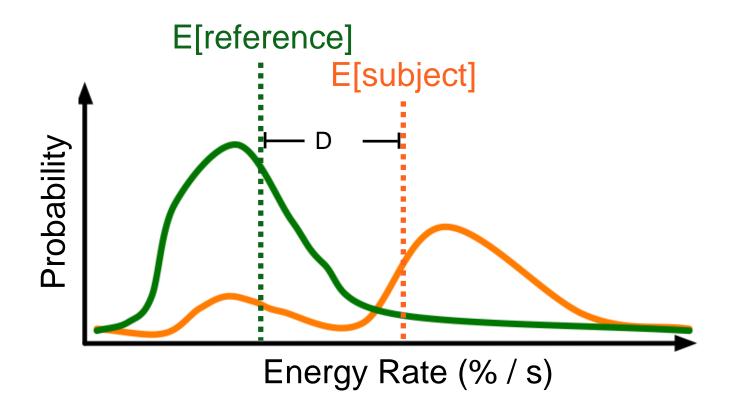
## **Energy Anomalies**

(Given is not a Hog.)

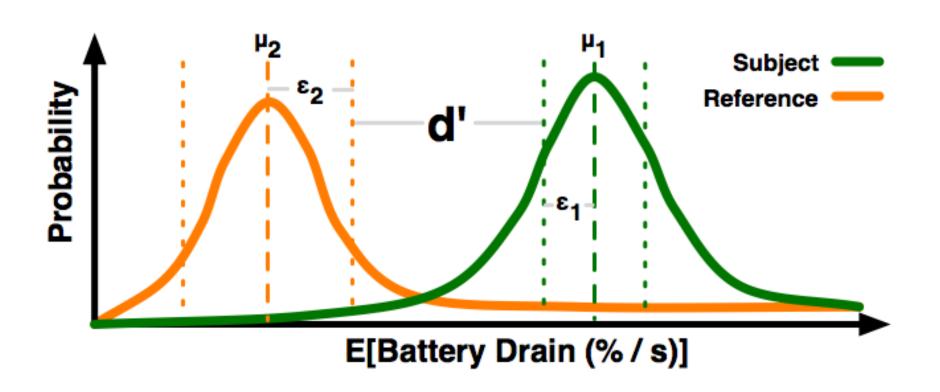


Without the crowd, there is no way to know whether this is normal.

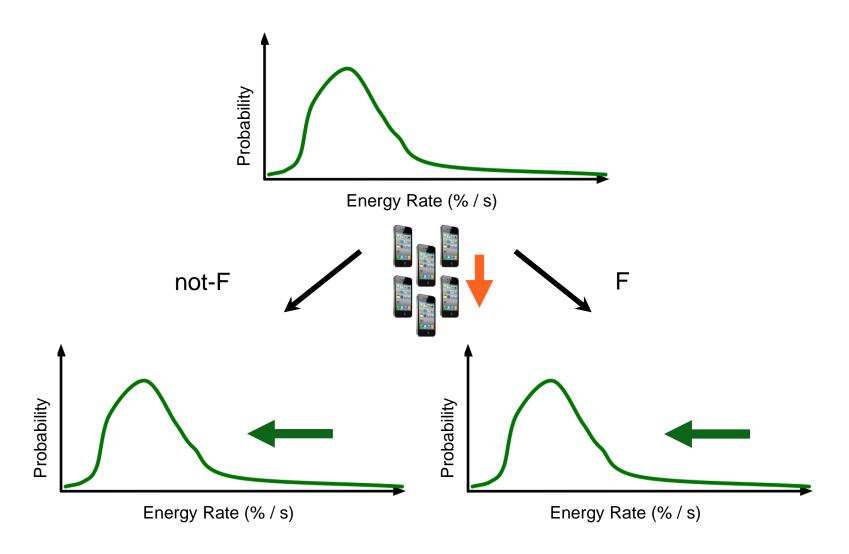
# **Original Distribution**



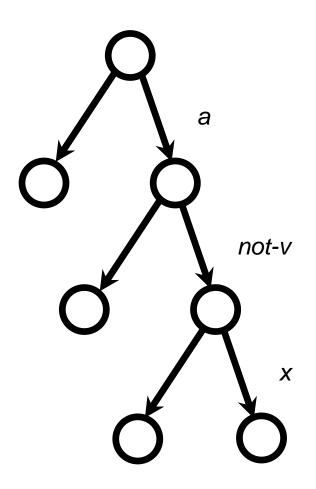
# "Significant"



## Classification



## **Diagnosis**



"Killing app a will give x±e of battery life (95% confidence), as would upgrading the OS to version v."

# **Carat Today**

- 450,000+ devices
  - 60% iOS
  - 40% Android
- Tens of millions of samples

# **Energy Anomalies**

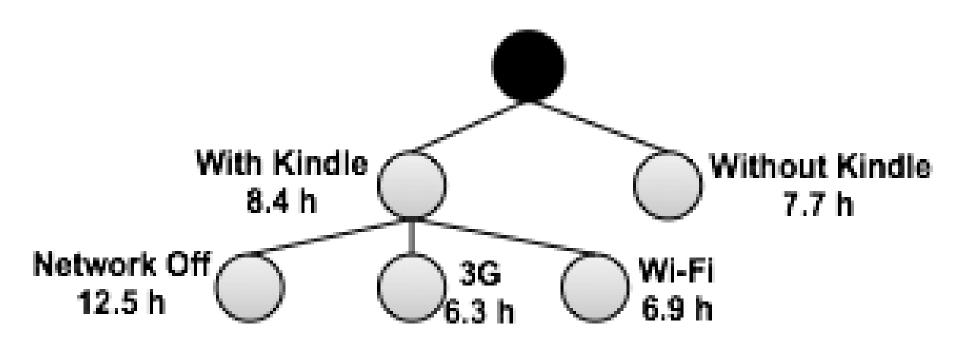
- Hogs
  - 11,256 hogs (9.4%)
  - e.g., Pandora and Skype
- Bugs
  - 483,354 buggy instances (5.3%)
  - e.g., Kindle, Facebook, and YouTube

# Kindle Bug (iOS)

- E-book reader
- Bug on 3.9% of clients
- Forum: WhisperSync
- Confirmed by our data
- Turn on WiFi improvement



# **Kindle Diagnosis**



### **Next Lecture: Mobile Communication**