

# Cellular Networks and Mobile Computing

COMS 6998-8, Spring 2012

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<http://www.cs.columbia.edu/~coms6998-8/>

2/20/2012: Ebugs, Power Models, Profiling  
and Debugging

# Announcements

- To obtain physical access to Gateway Lab, contact [mjg2203@columbia.edu](mailto:mjg2203@columbia.edu)
- Contact TA Hemin Merchant to provision your iOS devices
- Contact TA Jiawen Sun to get Amazon EC2 credits (one representative from each project team)
- Programming assignment 1 will be due on Monday, Feb 27th

# Outline

- The Rise of Ebugs
- Methods of Measuring Power Usage
- Power Models
  - Usage based
  - System call trace based
- Profiling
- Conclusion

# The Rise of Energy Bugs

Single Symptom:

**Severe, Unexpected** Battery Drain

Apps Need Not Crash

No Blue Screen Of Death

Common Perception:

Kill some apps to fix



# User Frustration (Dialer App EBug)

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Comment [24](#) by [mgil...@gmail.com](mailto:mgil...@gmail.com), Aug 14, 2011

This defect is a real P.I.T.A. - I don't want to use my phone as a phone because I have to restart it every time. If I forget then it's usually 30-40% battery gone by the end of the day.

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Comment [30](#) by [hansheng...@gmail.com](mailto:hansheng...@gmail.com), Aug 15, 2011

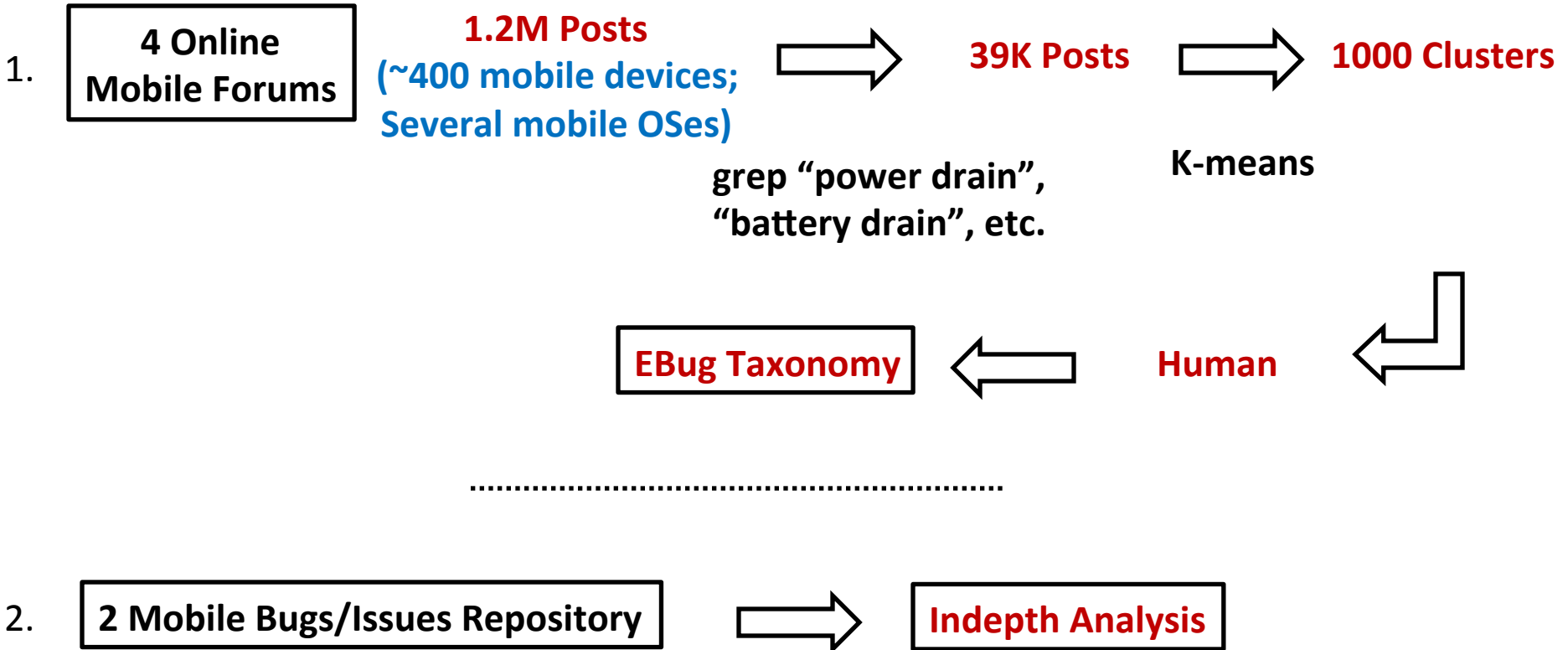
Bring your charger with you and keep it charged!!! That's the only way the phone can last a day. It's a irritating bug!!!

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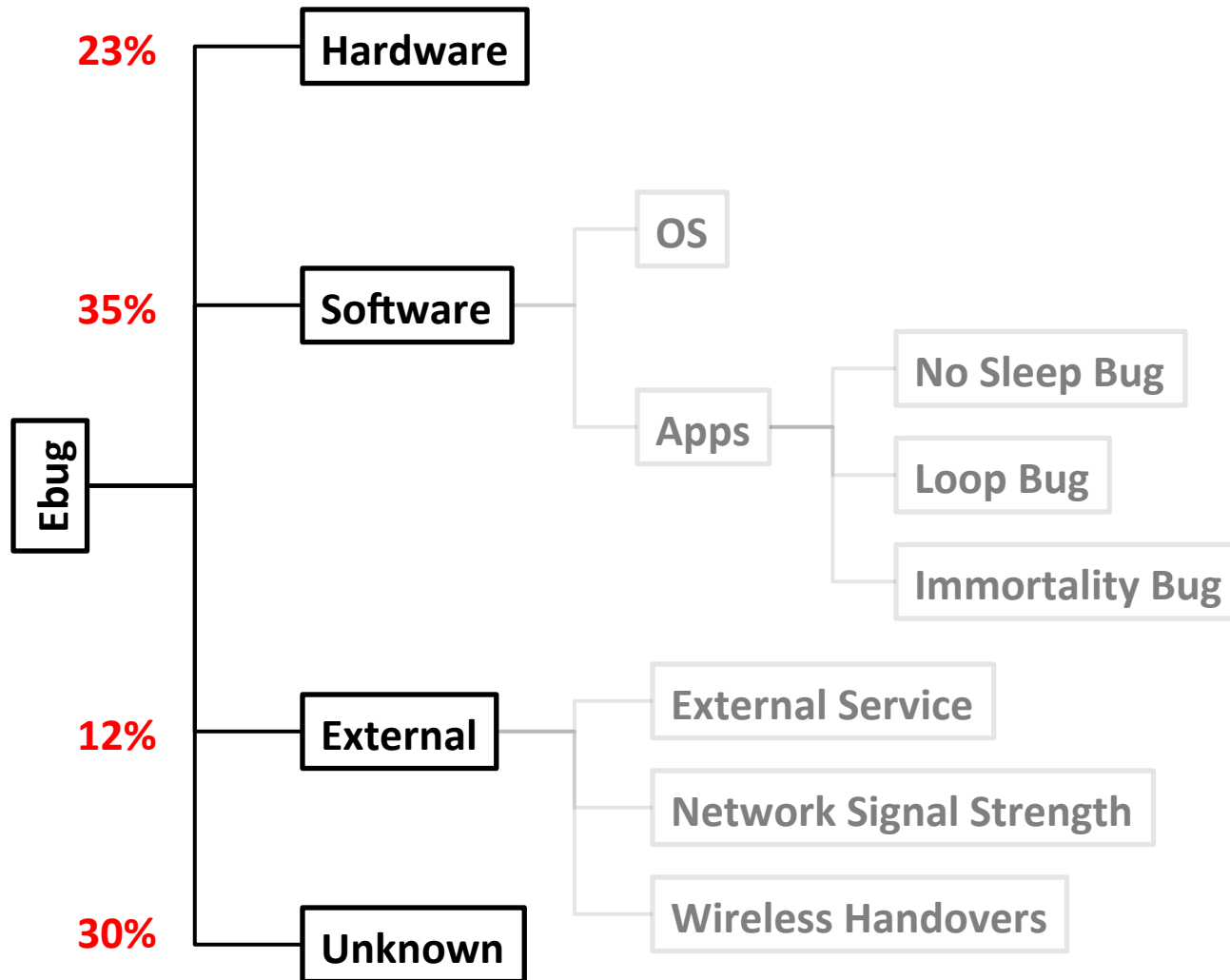
Comment [239](#) by [egork...@gmail.com](mailto:egork...@gmail.com), Nov 6 (6 days ago)

GOOGLE!!!!!!!!!! DO SOMETHING WITH THIS ISSUE!!! FASTER PLEASE!!!!

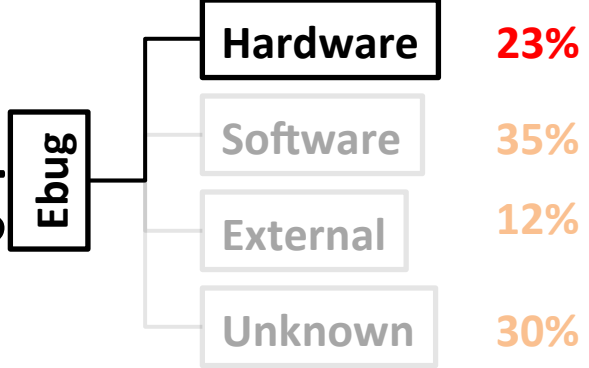
# Crawling Internet Forums



# Ebug Taxonomy



# Hardware EBug



**Battery**



**External Hardware**



**Sim Card**



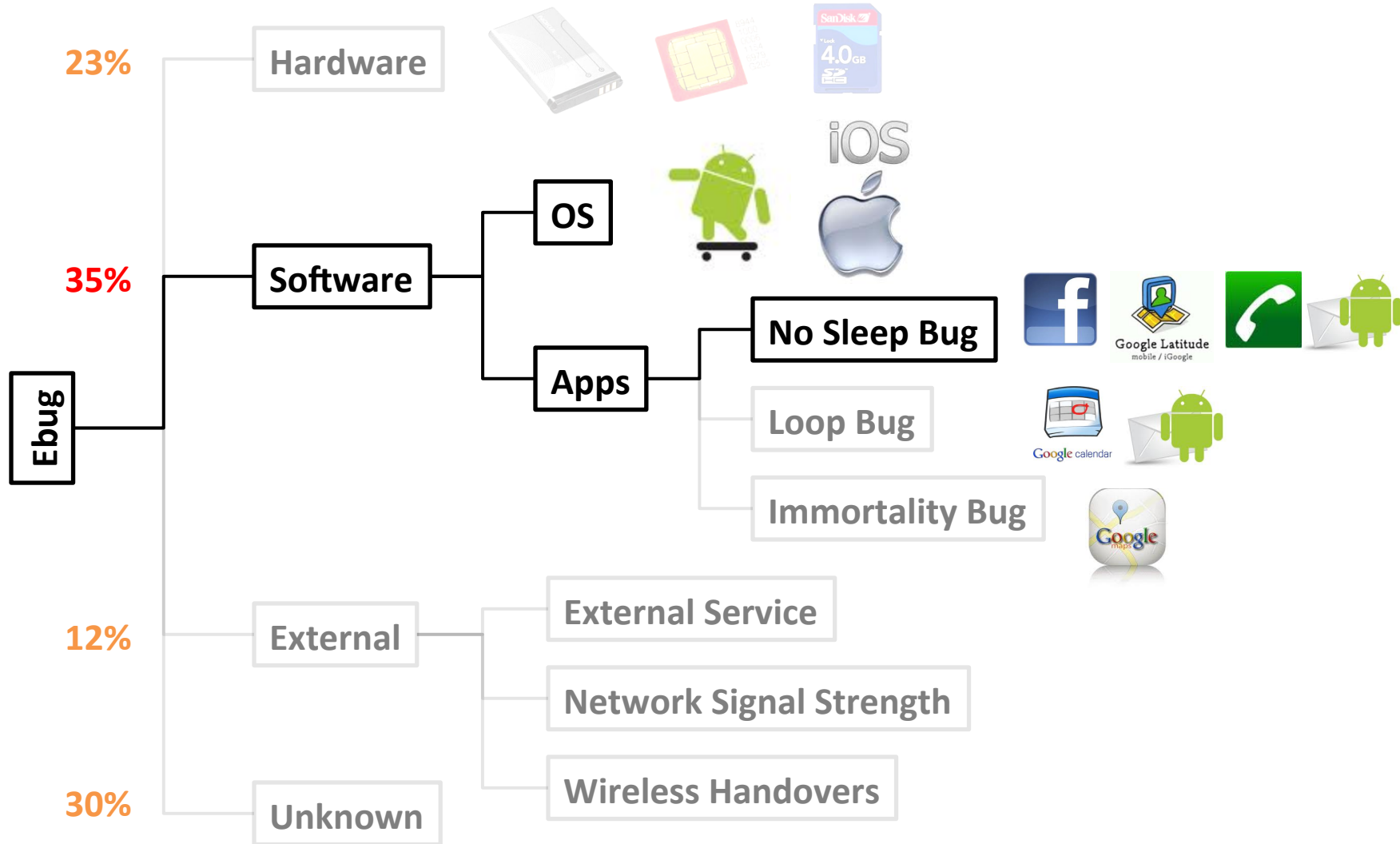
**Exterior Hardware Damage**



**SDCard**



# Ebug Taxonomy



# OS Ebugs



HOT TOPICS [APPLE](#) [ANDROID](#) [GOOGLE](#) [REPUBLIC WIRELESS](#) [FACEBOOK](#) [ADOBE](#)

## iPhone 4S Battery Life Bugs Got You Down?

### Battery life on the iPhone 4S: the new 'death grip'?



By **Doug Gross**, CNN  
updated 4:17 PM EST, Tue November 1, 2011 | Filed under: [Mobile](#)

### iPhone battery fix coming 'in a few weeks'



By **Doug Gross**, CNN  
updated 11:19 AM EST, Thu November 3, 2011 | Filed under: [Mobile](#)

**IOS Version: 4.0 – 4.3.3 (5% posts)**



**2.5% posts**

Why does OS Leak Energy?

– Hard to infer

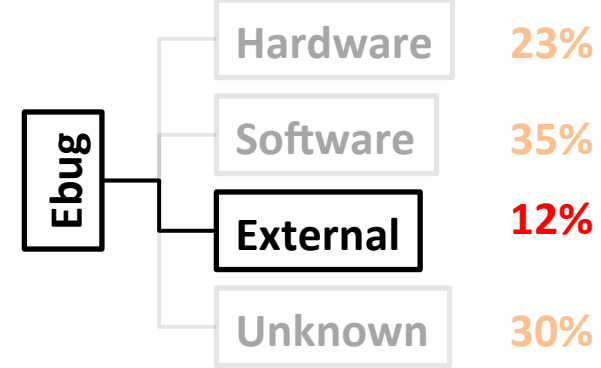
– OS Processes

– System Configuration

# Apps EBug: No Sleep Bug

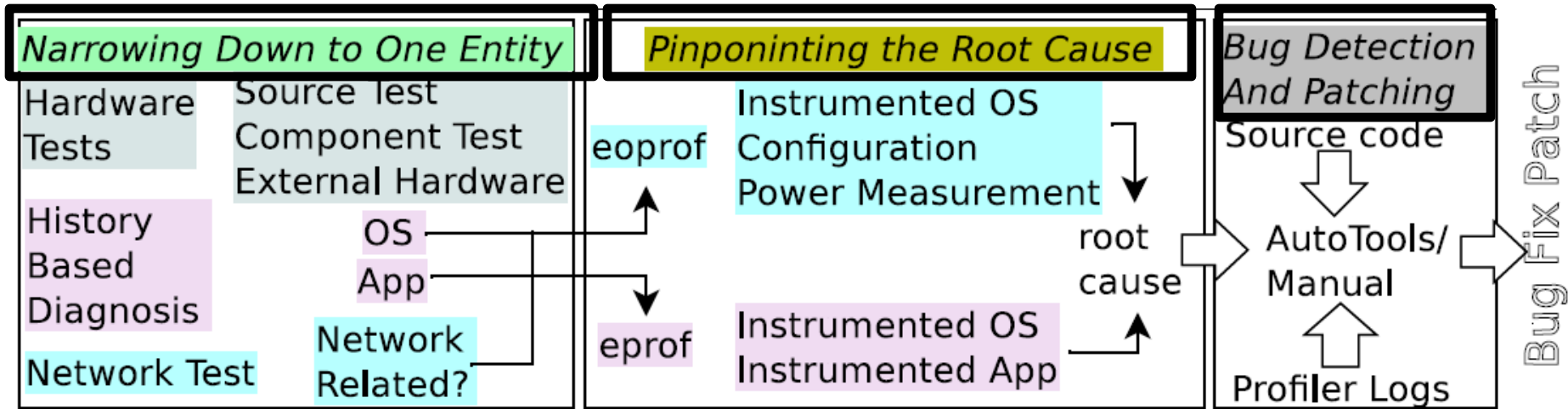
- **Aggressive Sleeping Policies:** Smartphone OSes freeze system after brief inactivity
- **Power encumbered Programming:** Programmer has to manage sleep/wake cycle of components
- **No Sleep Bug:** At least one component is kept awake due to mismanagement

# External Conditions



- External Services (<1%)
- Network Signal Strength (11%)
- Wireless Handovers (<1%)

# EDB: Energy Debugging Framework



# Mobile Programming EcoSystem: The EBug Blame Game

Network Operators



App Developers



Hardware Manufacturers



Framework Developers



Firmware/OEM Developers



Kernel Developers

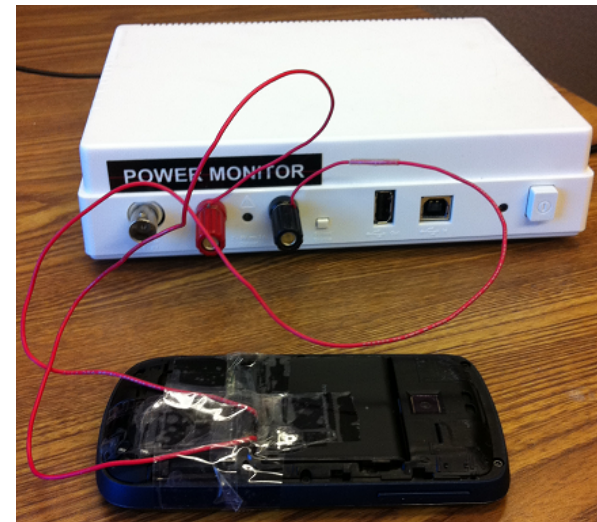


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# Measuring Power Usage

- Approach 1: Use power meter (offline)
  - Buy an expensive equipment (\$770)
  - Problems:
    - Only reports entire device energy consumption
- Approach 2 : Use built-in battery sensor (online)





# iOS Battery API

- Use `UIDevice` class to obtain information and notifications about
  - charging state (property `batteryState`)
  - charging level (property `batteryLevel`)

```
1.  [[UIDevice currentDevice] setBatteryMonitoringEnabled:YES];
2.      NSArray *batteryStatus = [NSArray arrayWithObjects:
3.          @"Battery status is unknown.",
4.          @"Battery is in use (discharging).",
5.          @"Battery is charging.",
6.          @"Battery is fully charged.", nil];
7.  if ([[UIDevice currentDevice] batteryState] == UIDeviceBatteryStateUnknown)
8.      NSLog(@"%@", [batteryStatus objectAtIndex:0]);
9.  else
10.  {
11.      NSString *msg = [NSString stringWithFormat:
12.          @"Battery charge level: %0.2f%%\n%@",
13.          [[UIDevice currentDevice] batteryLevel] * 100,
14.          [batteryStatus objectAtIndex:[UIDevice currentDevice]
15.              batteryState]];
16.      NSLog(@"%@", msg);
17.  }
```

# Android Battery API

- Sample updates stored in files:
  - Current: `/sys/class/power_supply/battery/batt_chg_current`
  - Voltage: `/sys/class/power_supply/battery/batt_vol`
  - Capacity: `/sys/class/power_supply/battery/capacity`

```
1. File fcur = new File("/sys/class/power_supply/  
   battery/batt_chg_current");  
2. if (fcur.exists())  
3.     ...
```

- File names are vendor dependent
- [Access using Android Debug Bridge \(adb\)](#)
  - `<sdk>platform-tools`
  - Command: `adb shell`

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# Smartphone is Energy Constrained

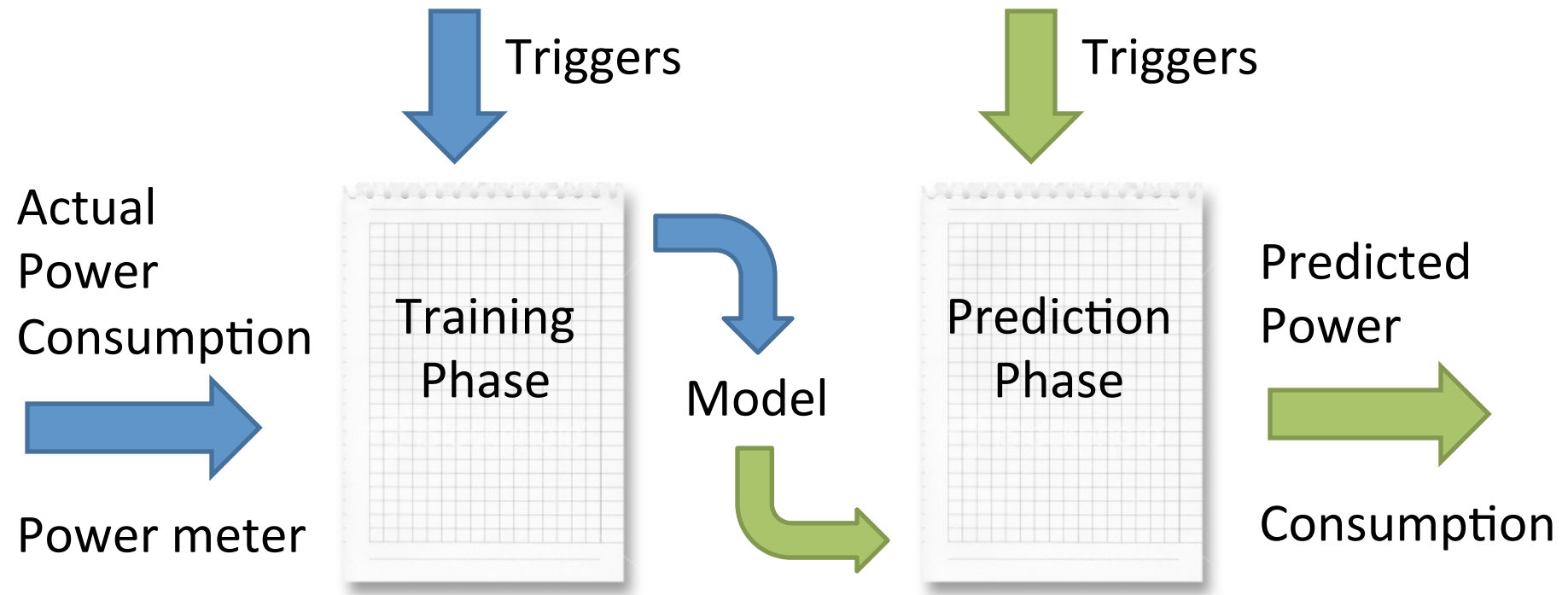
- Energy: One of the most critical issues in smartphones
  - Limited battery lifetime
- Battery energy density only doubled in last 15 yrs
- Smartphone capability has increased drastically
  - Multiple Components: GPS, 3G, retina display, ....



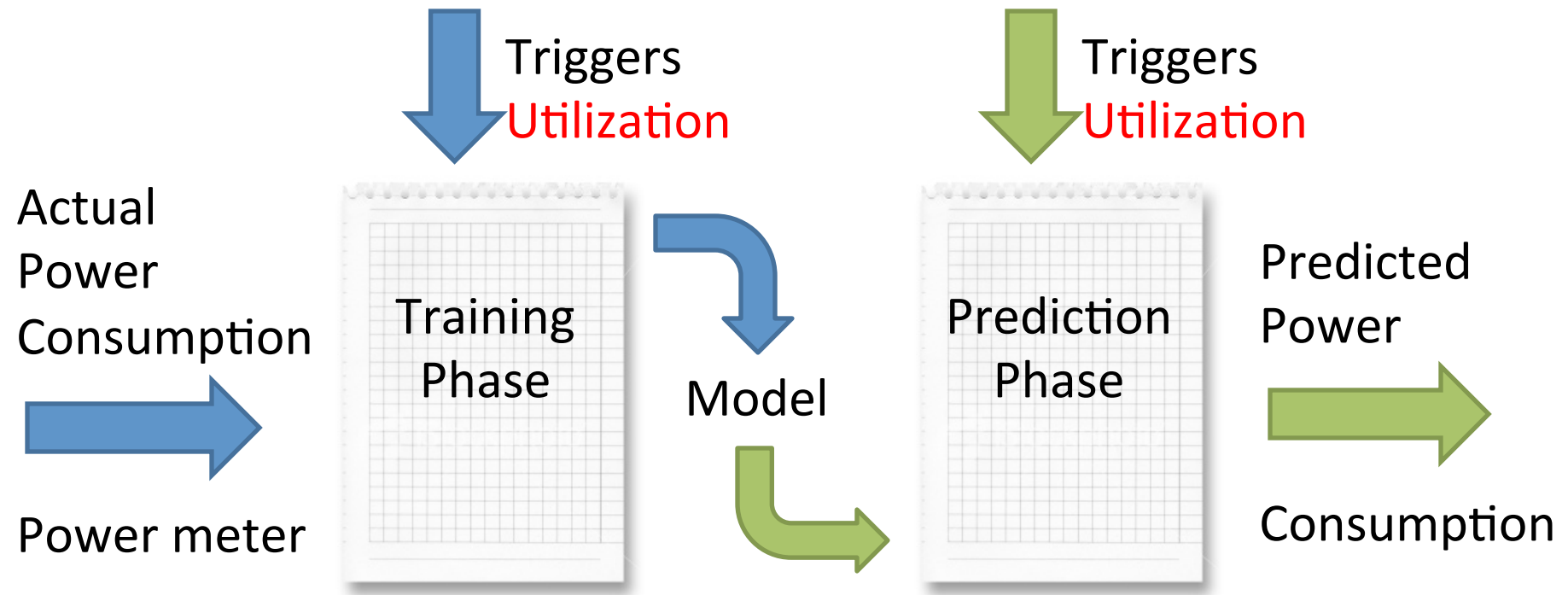
# Towards Understanding Energy Drain

- Key Question: Where is energy being spent?
  - Which component/process/thread/function(?)

# Generic Power Modeling



# Smartphone Power Modeling: Utilization Based (1/3)



Linear Regression (LR) and Superimposition

$$\text{Model} = (\text{Util}_{\text{Net}}) * E_{\text{Net}} + (\text{Util}_{\text{CPU}}) * E_{\text{CPU}} + (\text{Util}_{\text{Disk}}) * E_{\text{Disk}}$$

# Smartphone Power Modeling: Utilization Based (2/3)

- PowerTutor model

$$\begin{aligned} & (\beta_{uh} \times freq_h + \beta_{ul} \times freq_l) \times util + \beta_{CPU} \times CPU\_on + \beta_{br} \times brightness \\ & + \beta_{Gon} \times GPS\_on + \beta_{Gsl} \times GPS\_sl + \beta_{Wi-Fi_l} \times Wi-Fi_l \\ & + \beta_{Wi-Fi_h} \times Wi-Fi_h + \beta_{3G\_idle} \times 3G\_idle + \beta_{3G\_FACH} \times 3G\_FACH \\ & + \beta_{3G\_DCH} \times 3G\_DCH \end{aligned}$$

$\beta$  : power coefficient.

util, brightness and etc.: system variables.

- Sesame paper has two optimizations: model molding, principle component analysis (PCA)



# Smartphone Power Modeling: Utilization Based (3/3)

$$\text{Model} = (\text{Util}_{\text{Net}}) * E_{\text{Net}} + (\text{Util}_{\text{CPU}}) * E_{\text{CPU}} + (\text{Util}_{\text{Disk}}) * E_{\text{Disk}}$$

Fundamental (yet intuitive) assumption

*(Only active) Utilization => power consumption*



Second assumption

*Energy scales linearly with amount of work*



Third assumption

*Components power consumption add linearly*



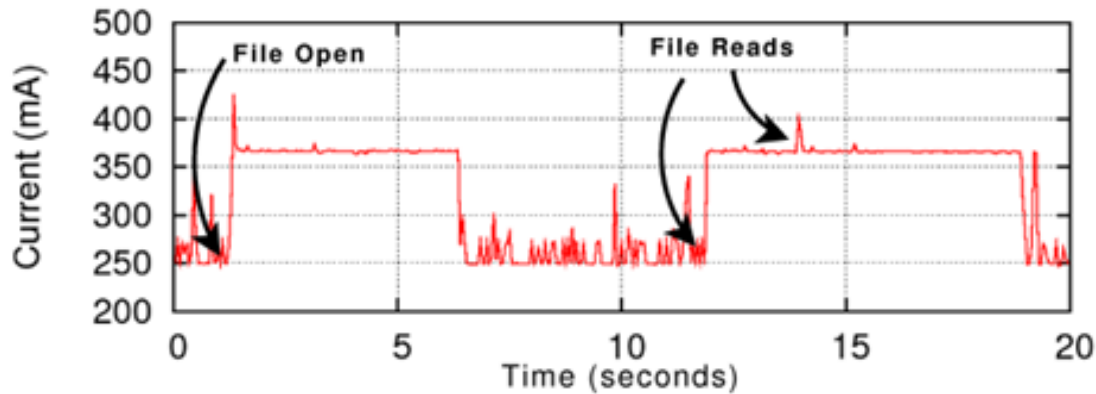
Desired Feature

Which process/thread/function? Hard to correlate

# (Only active) Utilization => Power Consumption



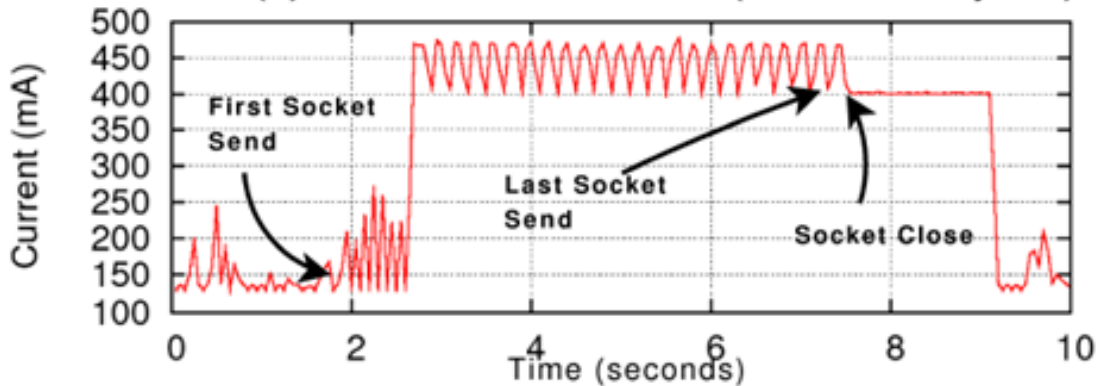
(a) File Open and Read (on WM6 on Touch)



File open/delete/  
close/create  
change power state



(c) Socket Send and Close (on WM6 on Tytn II)

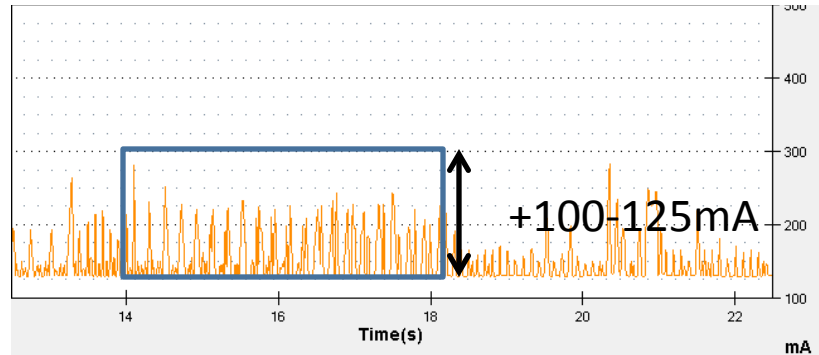


Several components  
have tail states  
(3G, disk, wifi, gps)

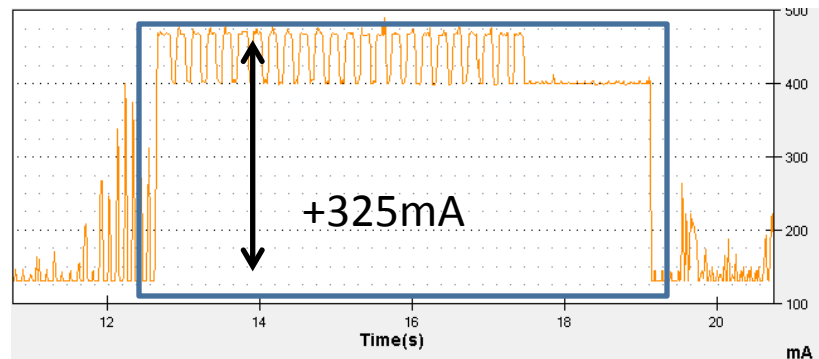
# Energy scales linearly with amount of work



WM6.5 on Tytn II



- (1) Send packets @  $< 50$ pkts/s

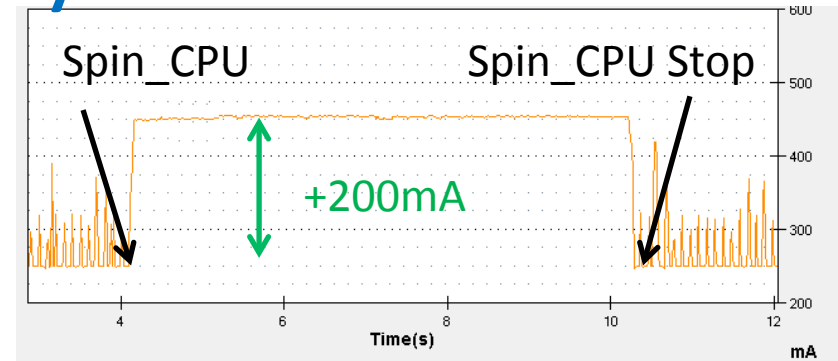
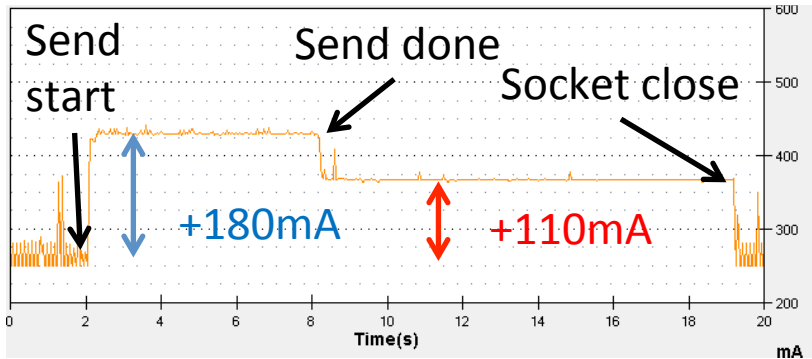


- (2) Send packets @  $> 50$ pkts/s

# Components power consumption add

linearly

WM6.5 on HTC Touch



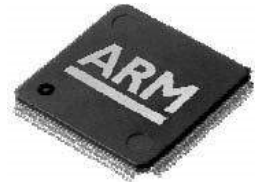
(1) Send(10mb);  
sleep();  
Socket.close();

Spin\_CPU(2M)  
(i = 1)

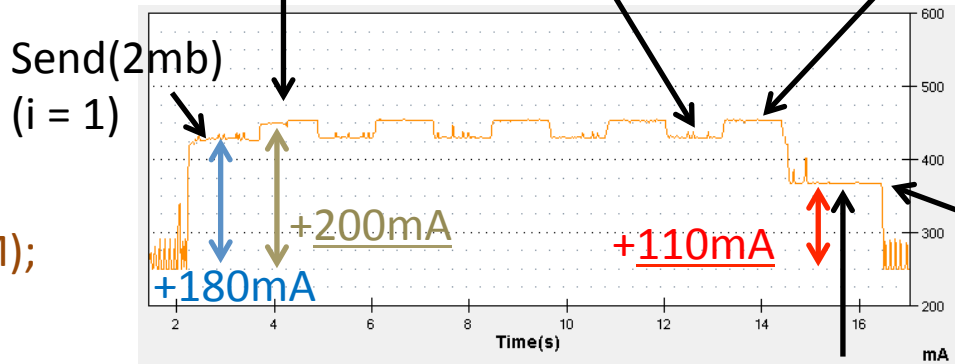
Send(2mb)  
(i = 5)

Spin\_cpu(2M)  
(i = 5)

(2) Spin\_CPU(10M);



(3)  
for (i in 1 to 5){  
  Send(2mb);  
  Spin\_CPU(2M);  
}  
Sleep();  
Socket.close();



Network tail

Socket close

## What have we learnt so far?

Simple (state-of-art) energy modeling assumptions are wrong  
There exists a notion of power states

## What have we hinted so far?

Device drivers have intelligent power control rules  
System calls play a role in power consumption

## Challenges in fine-grained power modeling?

Device drivers are closed source (no code/no information)

# System Calls As Power Triggers

Key observation: System call is the interface through which an application communicates with the underlying system (hardware) and outside world (Internet, GPS, etc.)

Key Idea: Use System Calls as triggers in power modeling

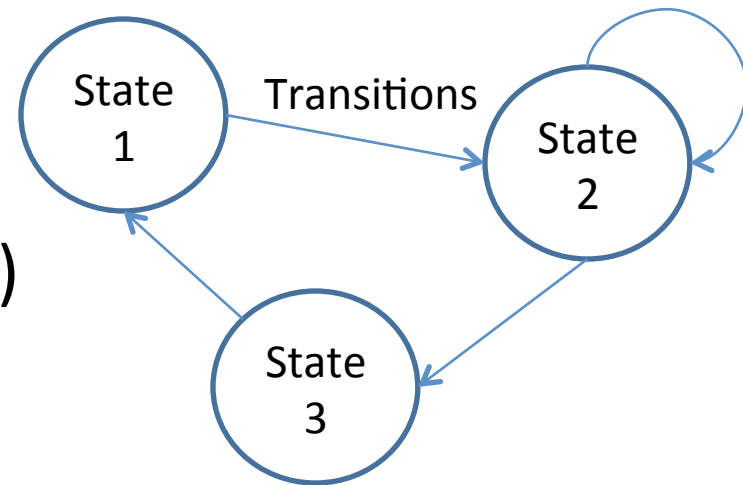
## Advantages:

- Encapsulates utilization based triggers
  - Parameters of system calls
- Captures power behavior of ones that do not necessarily imply utilization
- Can be traced back to process, thread, function
  - Eases energy accounting

# Finite-State-Machine (FSM) as Power Model Representation

## We Use Finite-State-Machine (FSM)

- **Nodes:** Power states
  - Base State: No activity on phone
  - Productive state: Actual utilization
  - Tail state: No-useful work
- **Edges:** Transition rules
  - System calls (start/completion)
  - Workload (Ex: 50 pkts/sec)
  - Timeout



# FSM Power Model Construction

- Systematic 'Brute Force' Approach
  - Step 1 : Model Single System Call
  - Step 2 : Model Multiple System Calls for Same Component
  - Step 3 : Model Multiple Components (Entire Phone)
- Requires domain knowledge
  - Semantics of system calls

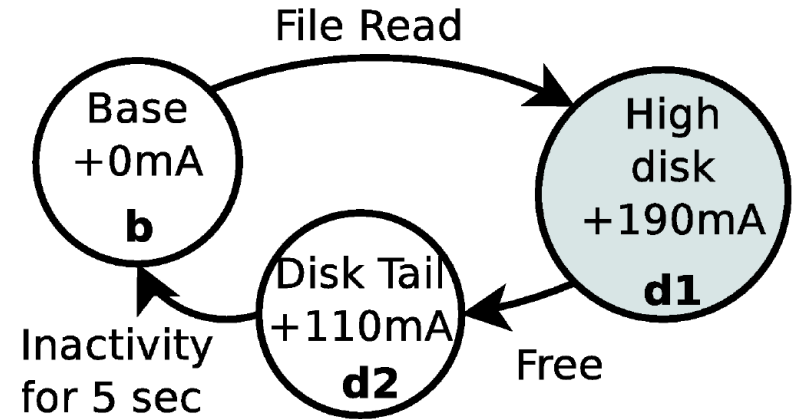
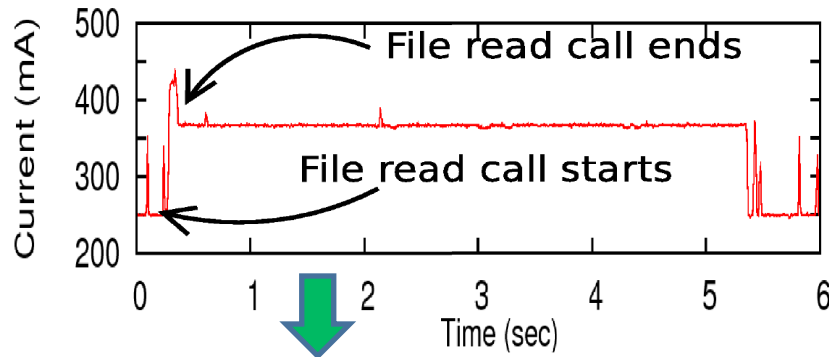


# Step 1: Single System Call FSM

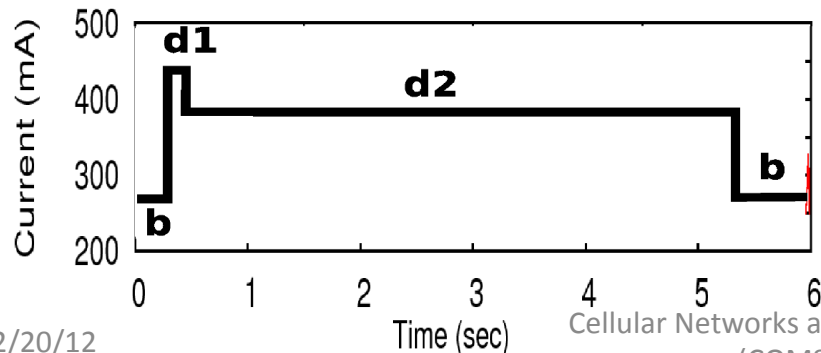
WM6.5 on HTC Touch

**System call:** read (fd, buf, size);

Measured power consumption + system calls (trigger)



Modeled power consumption



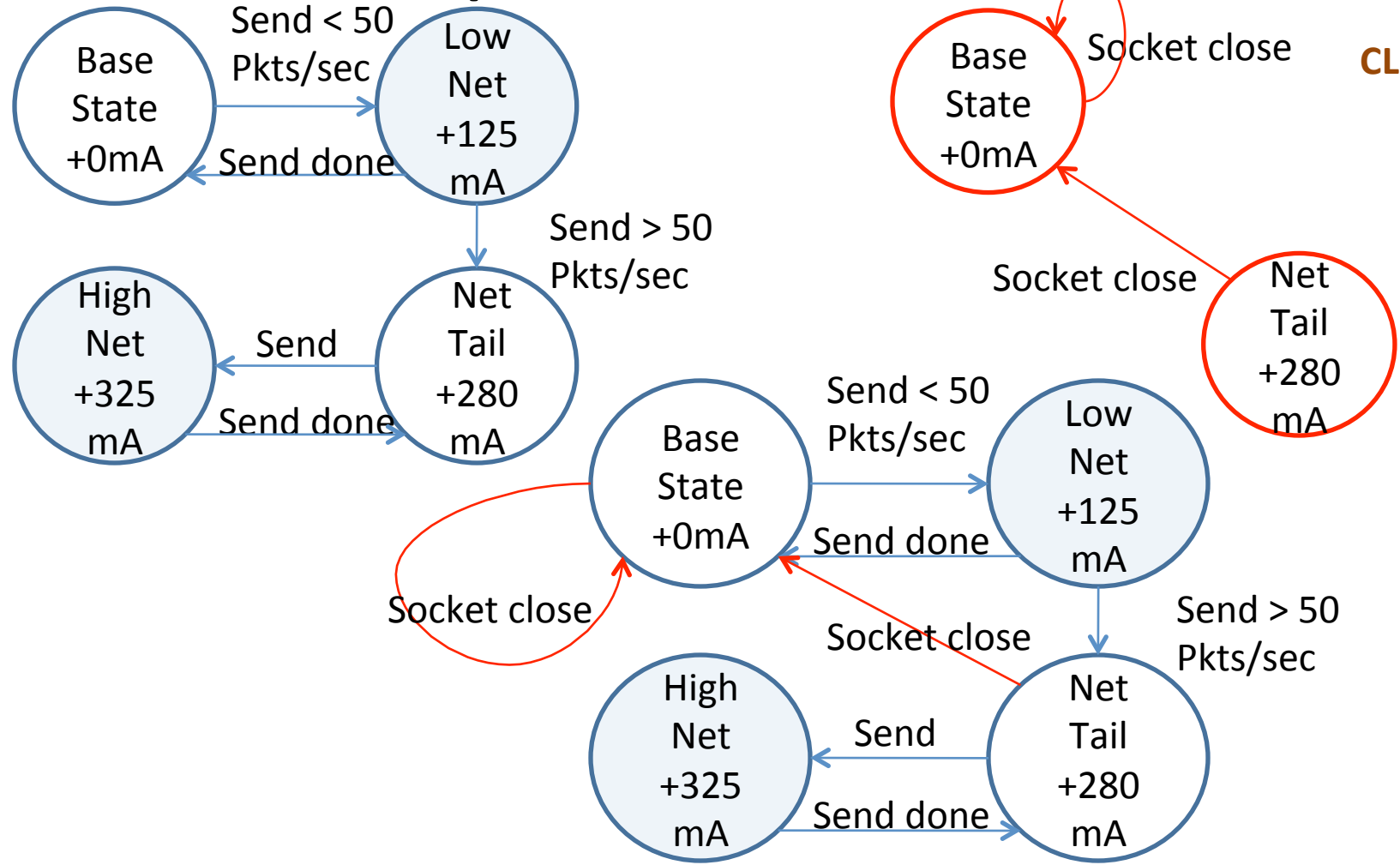
FSM

# Step 2: Modeling Multiple System Calls of Same Component

- Observation: A component can only have a small finite number of power states
- Methodology
  - Identify and merge similar power states
  - Obey programming order
  - Model concurrent system calls

# Step 2: WiFi NIC

**SEND**



**CLOSE**

# Step 3: Modeling Multiple Components

- Observation: Different components may interact with each other's power consumption
- Methodology
  - Try to reach different combination of states
  - Construct new states and transitions in FSM

# Implementation



- Windows Mobile 6.5
  - Extended CeLog



- Android
  - System Tap: Logs kernel events
  - Android debugging framework: Custom logging in Dalvik VM

# Evaluation: Handsets Used



HTC Tytn II

Win 6.5 (CE 5.2)



HTC Touch

Win 6.5 (CE 5.2)



HTC Magic

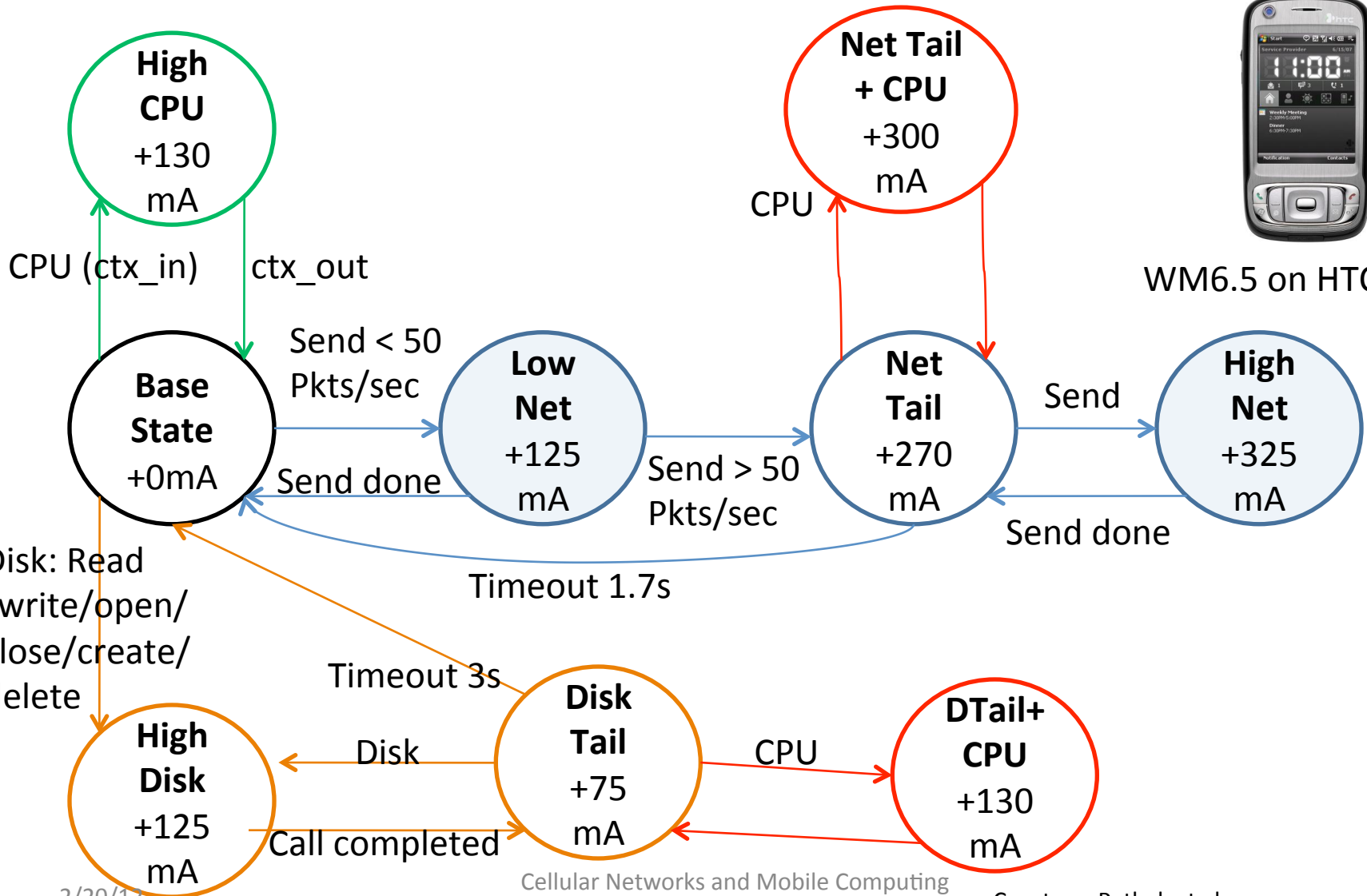
Android (Linux 2.6.34)



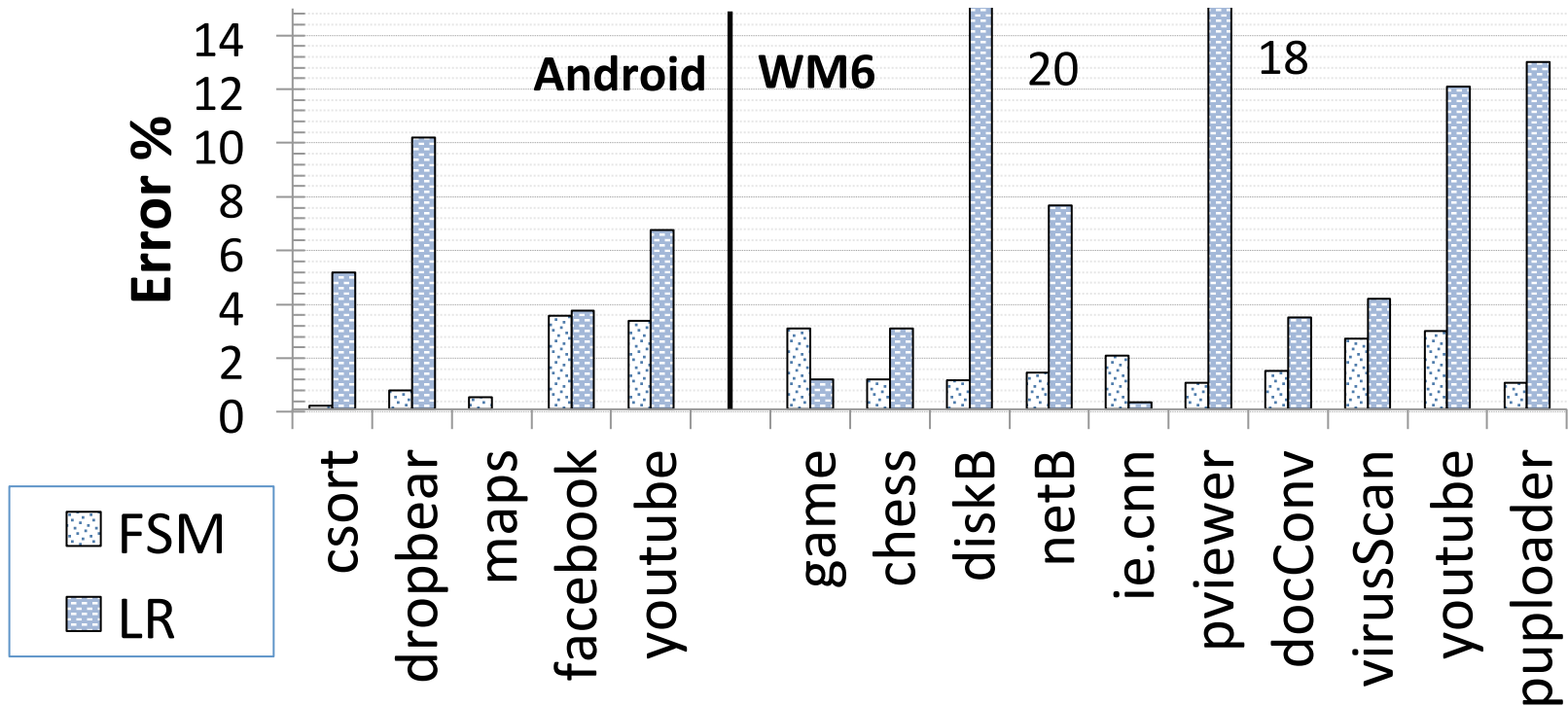
# Snapshot of FSM for Entire Phone



WM6.5 on HTC Tytn II



# End-To-End Energy Estimation Error

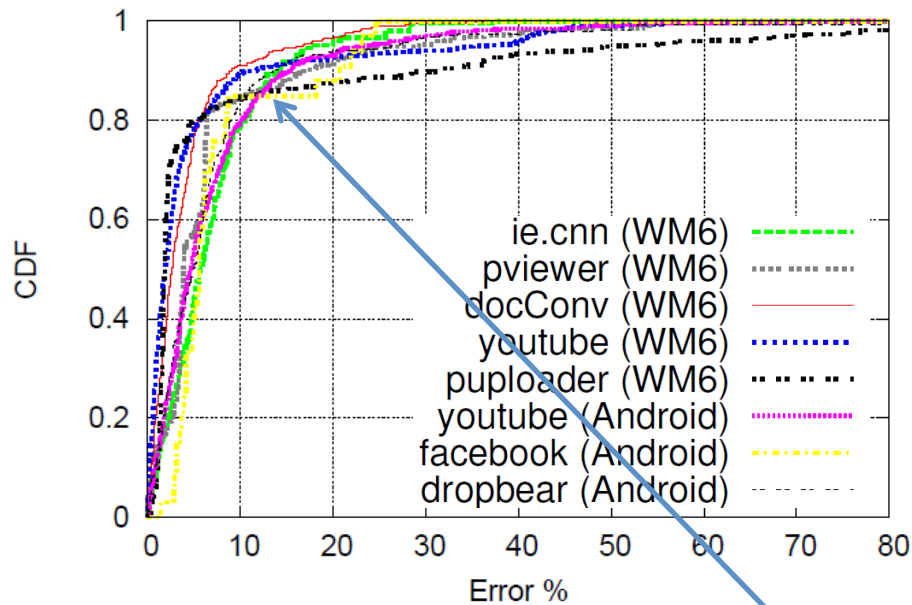


FSM: under 4%  
LR: 1% – 20%

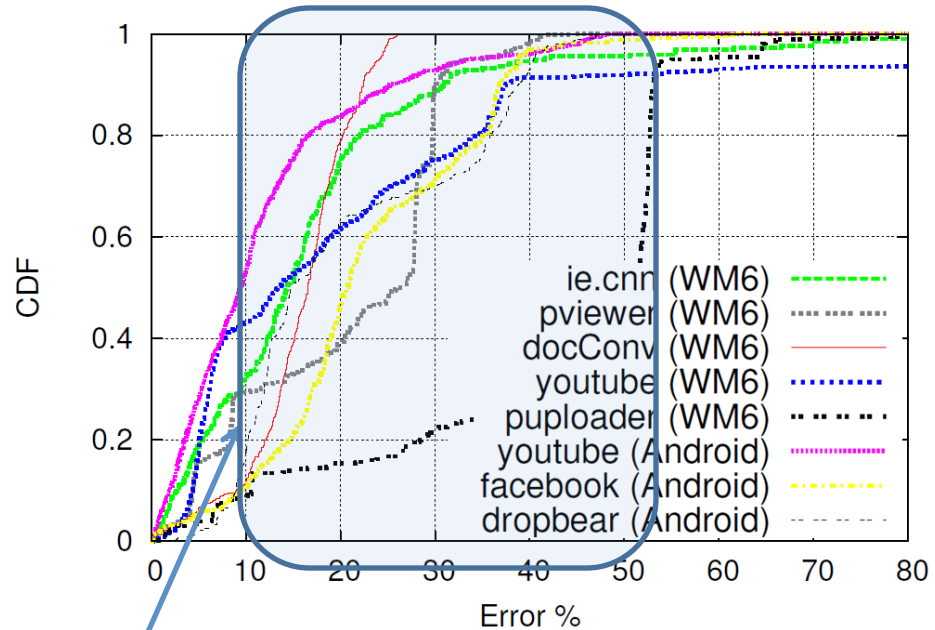


# Fine-Grained Energy Estimation

## CDF of energy estimation error per 50ms time interval



FSM based on System calls



Linear Regression (State-of-art)

FSM: 80<sup>th</sup> percentile error less than 10% for all apps  
LR: 10<sup>th</sup> percentile error less than 10% for all apps

# Outline

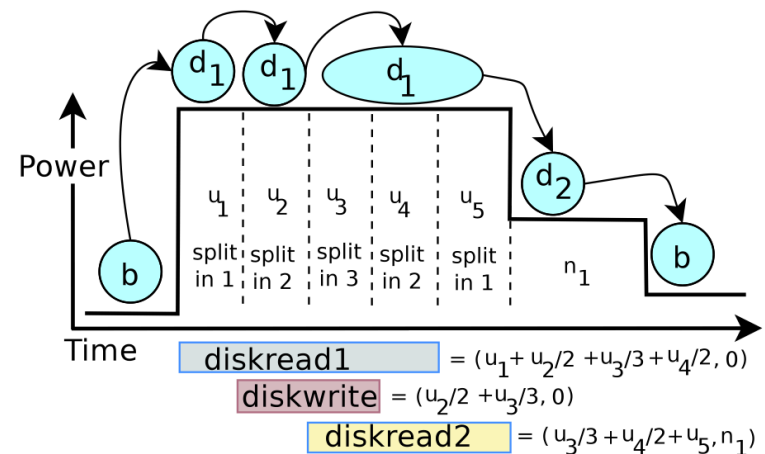
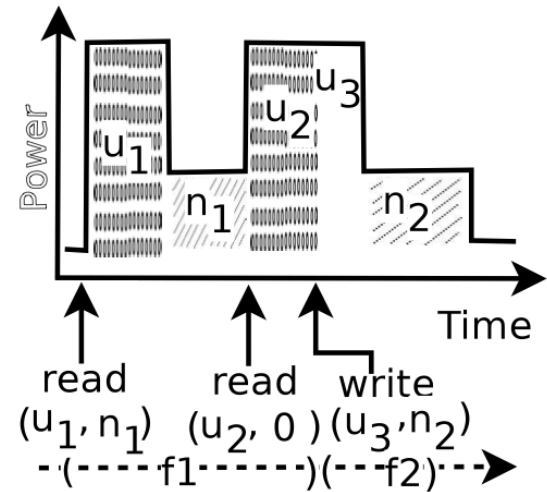
- The Rise of Ebugs
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- **Profiling**
- **Conclusion**

# Energy Profiling

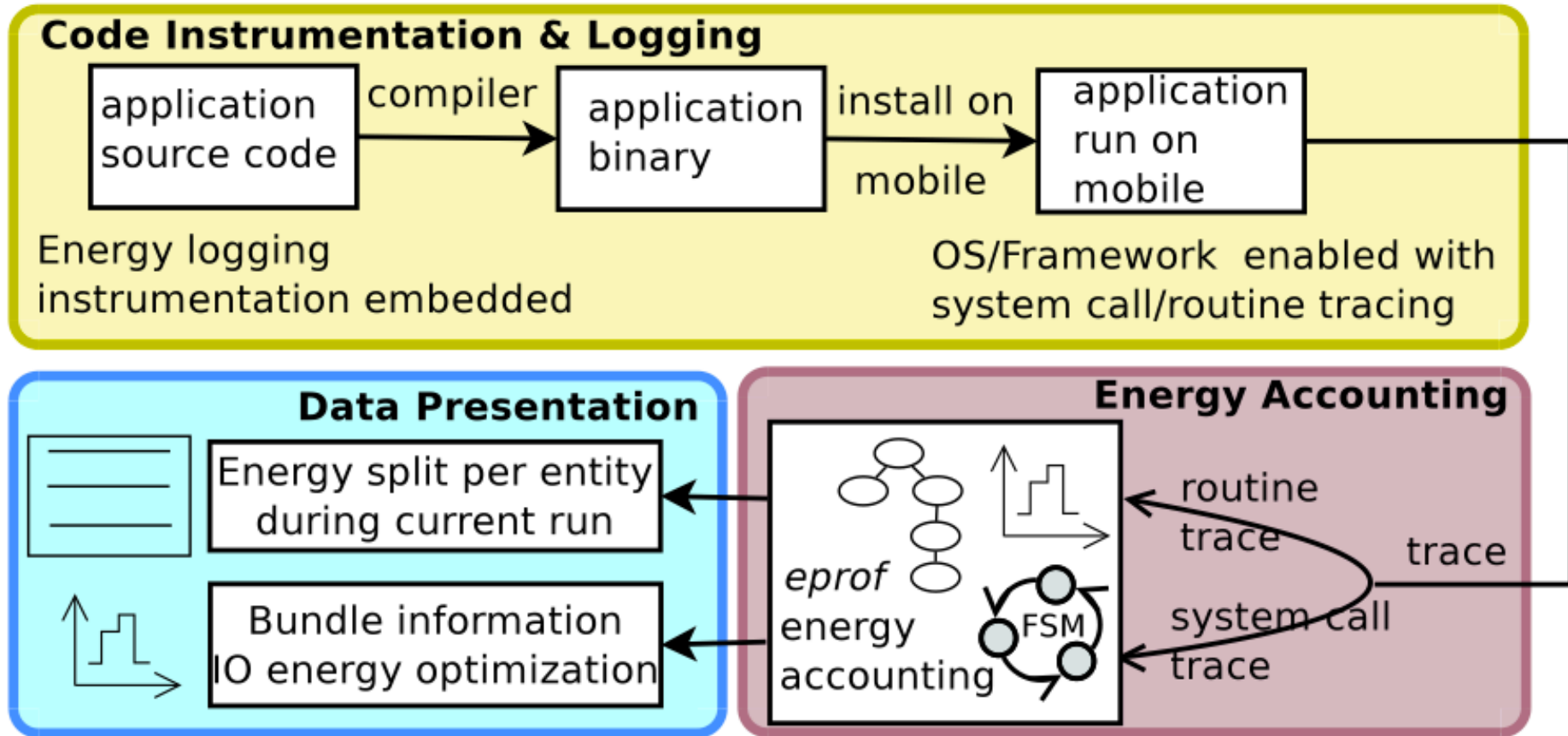
- eprof published in Eurosys 2012
- [QCOM Trepn Profiler](#)
  - Trepn leverages hardware sensors built into the Snapdragon MDP
  - Analyze power consumption of hardware blocks in the Snapdragon MDP, including:
    - CPU (system and auxiliary)
    - GPS
    - Bluetooth
    - Camera
    - Audio
    - Memory
    - Network data (optimizes data transfer frequency)

# eprof

- Accounting policies for asynchronous power
  - Tail power state energy consumption: attributed to last trigger
  - Concurrent accesses: divided among multiple system calls
  - Wakelocks and exotic components: attributed to the entities that acquired the wakelock



# eprof Architecture



# eprof Implementation

- SDK routine tracing: extend Android routing profiling framework
  - <http://developer.android.com/reference/android/os/Debug.html>
- NDK routine tracing: use gprof port of NDK
  - <http://code.google.com/p/android-ndk-profiler/>
- System call tracing: insert ADB logging APIs in framework code and log CPU (sched.switch) scheduling event in kernel using systemtap
  - <http://www.cyanogenmod.com/>

# eprof Evaluation

- Most energy spent on I/O

App	Run-time	#Routine calls (#Threads)	% Battery	3rd-Party Modules Used	<i>Where is the energy spent inside an app?</i>
browser	30s	1M (34)	0.35%	-	38% HTTP; 5% GUI; 16% user tracking; 25% TCP cond.
angrybirds	28s	200K (47)	0.37%	Flurry[7],Khronos[41]	20% game rendering; 45% user tracking; 28% TCP cond.
fchess	33s	742K (37)	0.60%	AdWhirl[42]	50% advertisement; 20% GUI; 20% AI; 2% screen touch
nytimes	41s	7.4M (29)	0.75%	Flurry[7],JSON[43]	65% database building; 15% user tracking; 18% TCP cond.
mapquest	29s	6M (43)	0.60%	SHW[44],AOL,JSON[43]	28% map tracking; 20% map download; 27% rendering

# Performance Optimization

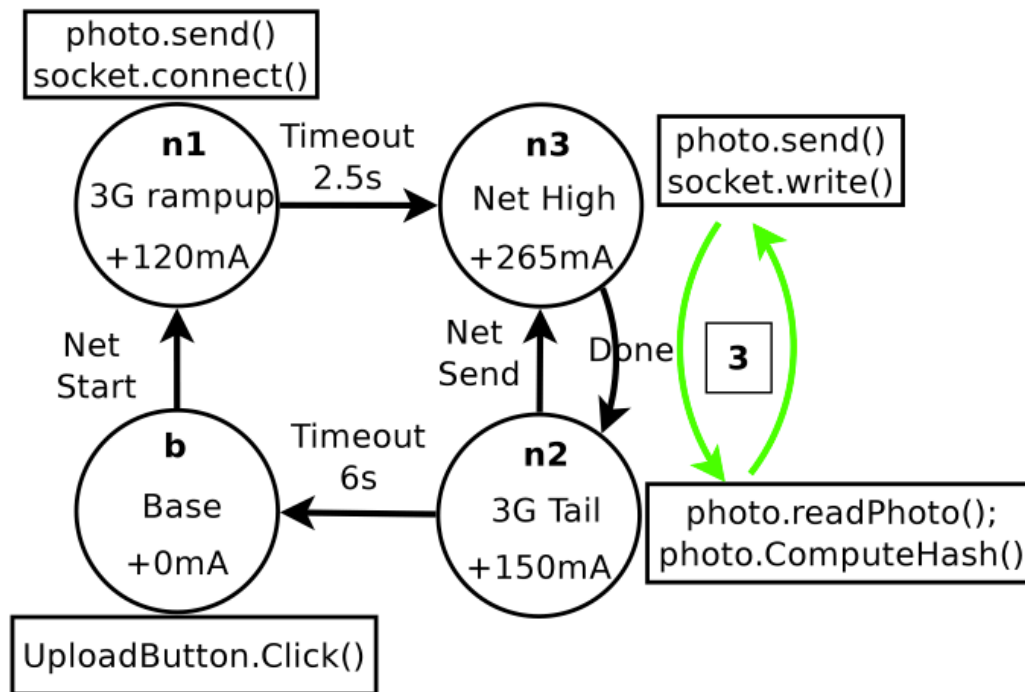
- Energy bundle: continuous period of an I/O component actively consuming power

App	Total I/O Energy	Bundles	#I/O Routines /total routines
Handset:tytn2 running WM6.5			
pslide	92%	3 (3 Disk)	2/21
pup	57%	3 (3 NET)	3/32
Handset:magic running Android			
syncdroid	50%	4 (1 NET, 3 DISK)	8/0.9K
streamer	31%	3 (3 NET)	4/1.1K
Handset:passion running Android			
browser	69%	3 (2 Net, 1 GPS)	5/3.4K
angrybirds	80%	4 (3 NET, 1 GPS)	5/2.2K
fchess	75%	2 (2 NET)	7/3.7K
nytimes	67%	2 (1 NET, 1 GPS)	16/6.8K
mapquest	72%	3 (2 NET, 1 GPS)	14/7.1K
pup	70%	1 (1 NET)	3/1.1K



# Performance Optimization (Cont'd)

- Energy bundle: continuous period of an I/O component actively consuming power



# Paper Contains ...

- **Detailed FSM construction**
  - Handling special cases (CPU Frequency, WiFi Signal Strength)
  - FSM for 3 smartphones
- **Detailed Accuracy Results**
  - Why our model performs better than state-of-art
- **Logging Overhead**
  - Under 10% overhead on both the OSES
- **Application: Energy Profiler**
  - Call-Graph Energy profiler for smartphone apps
  - Generates source code heat map

# Conclusion and Future work

- Ebugs need to be dealt with
- Fine-grained energy modeling and profiling very important to pinpoint energy bottleneck and ebugs
  - Accounting is tricky
  - I/O energy consumption is a major part
- Display energy modeling and profiling is still lacking

# Online Resources

- ded: decompiling android application tool
  - <http://siis.cse.psu.edu/ded/>

# Questions?