

Cellular Networks and Mobile Computing

COMS 6998-11, Spring 2012

Instructor: Li Erran Li
(lierranli@cs.columbia.edu)

[http://www.cs.columbia.edu/~lierranli/
coms6998-11Fall2012/](http://www.cs.columbia.edu/~lierranli/coms6998-11Fall2012/)

9/25/2012: Ebug debugging, Power Models,
and Profiling

Announcements

- Contact TA Jaimin Shah (jps2178@columbia.edu) to provision your iOS devices
- Programming assignment 2 will be due on Tuesday, Oct 2nd

Outline

- The Rise of Ebugs
- Debugging no-sleep 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)

Comment [24](#) by 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.

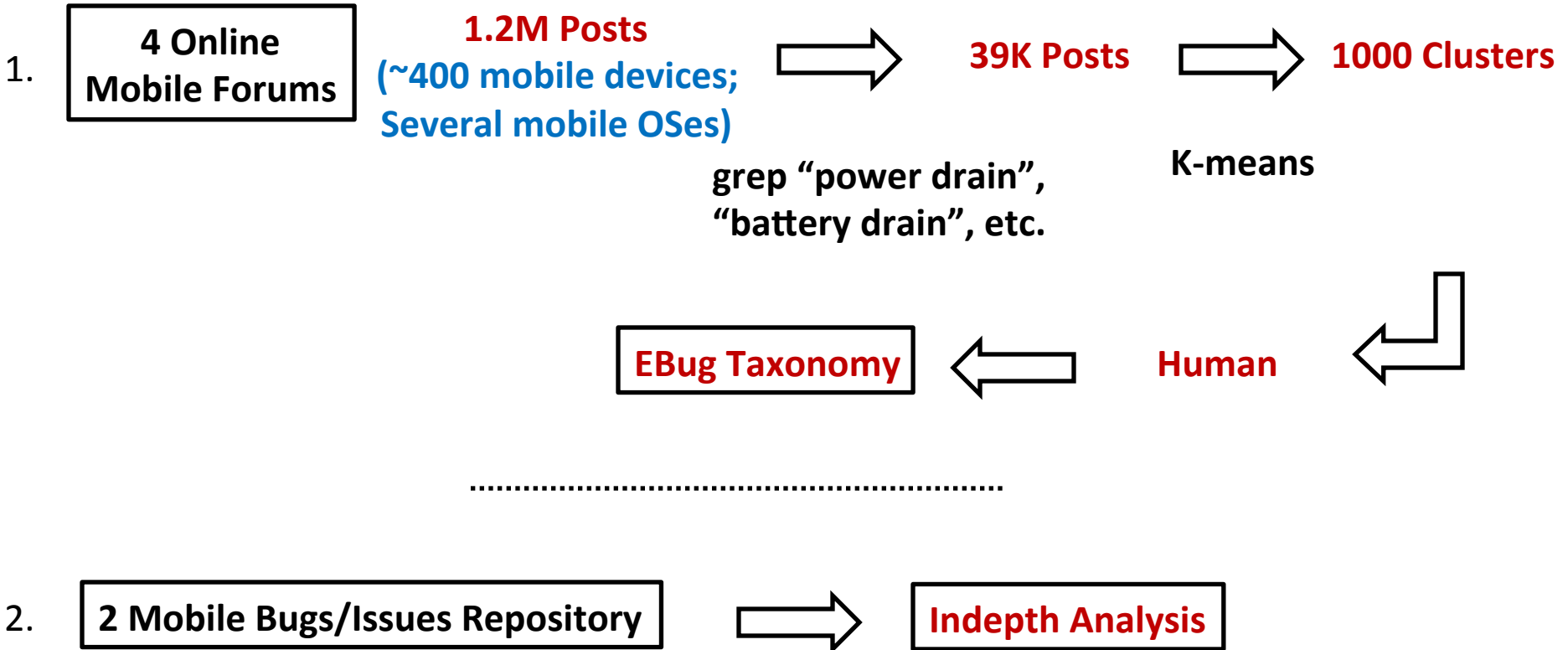
Comment [30](#) by hansheng...@gmail.com, Aug 15, 2011

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!!!

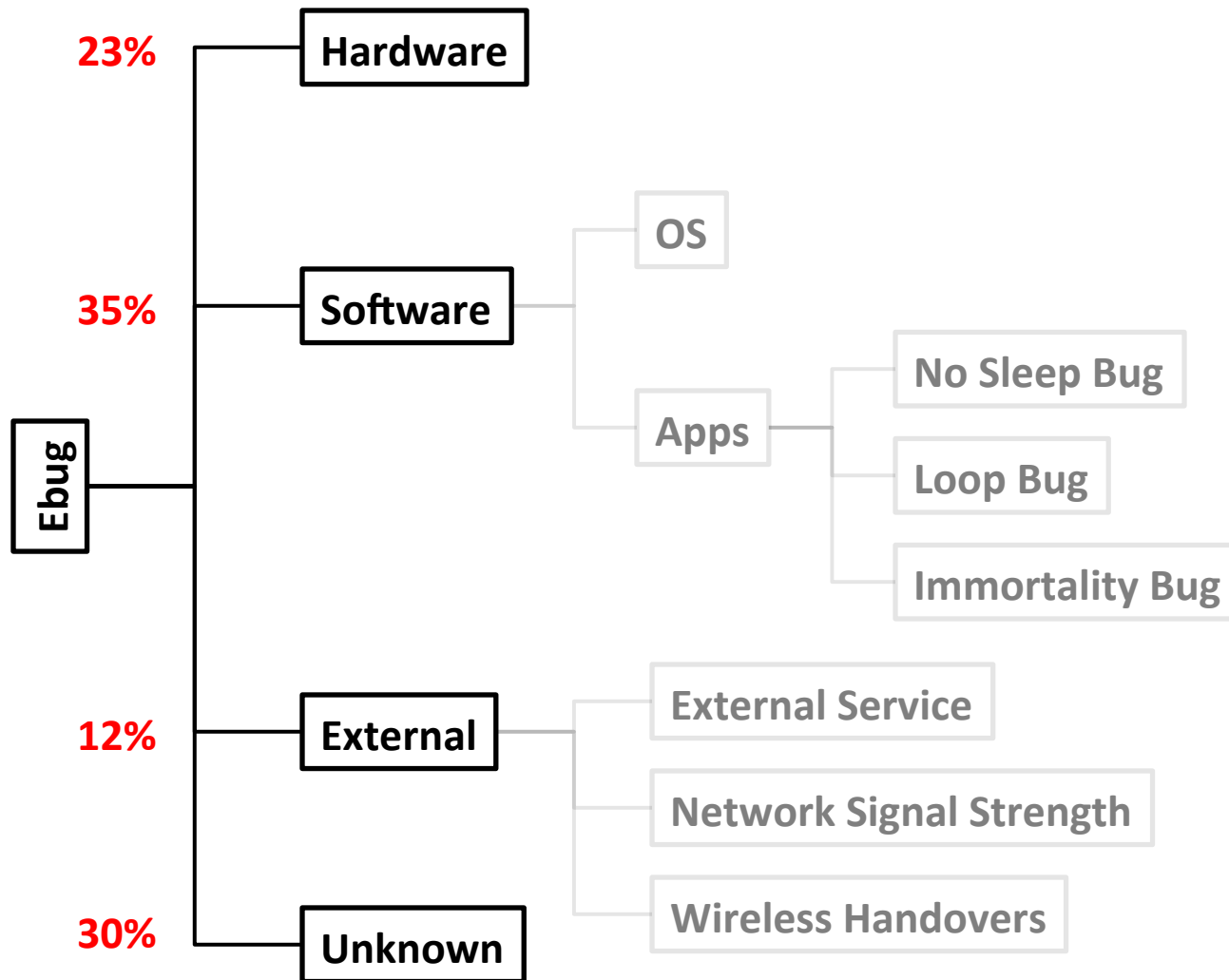
Comment [239](#) by egork...@gmail.com, Nov 6 (6 days ago)

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

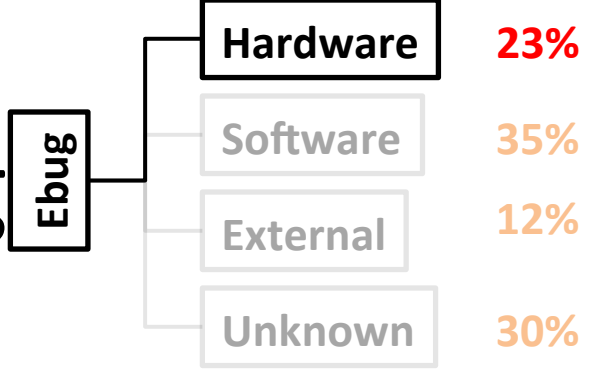
Crawling Internet Forums



Ebug Taxonomy



Hardware EBug



Battery



External Hardware



Sim Card

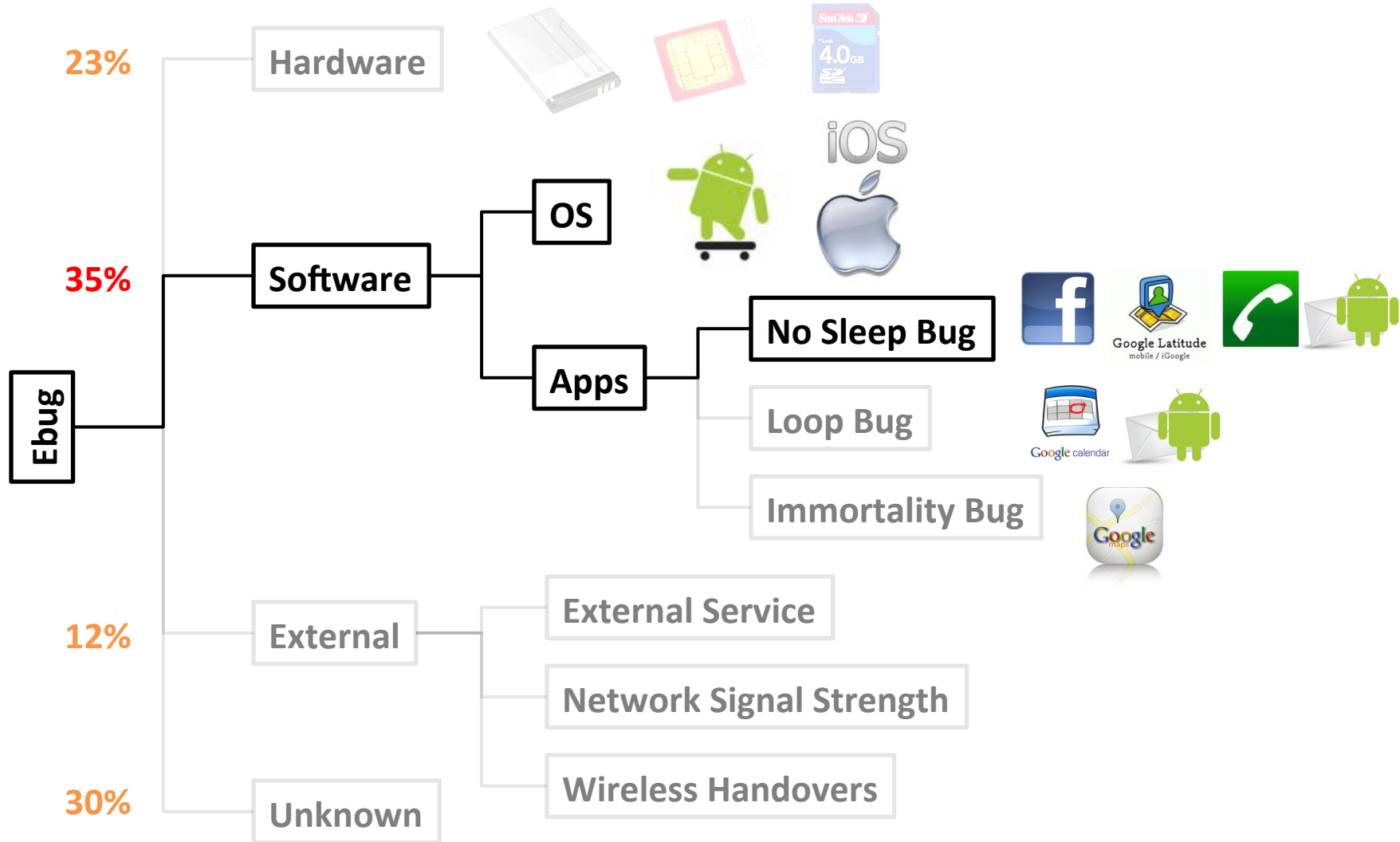


Exterior Hardware Damage



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

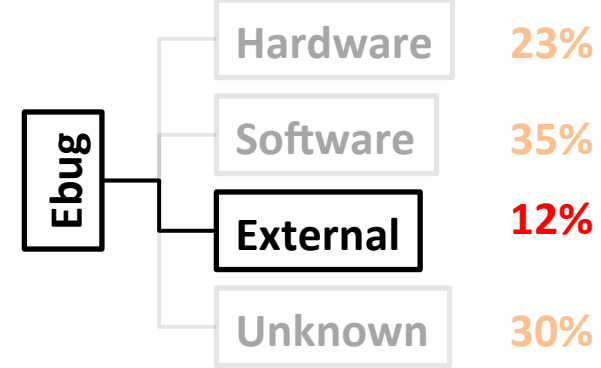
– OS Processes

– System Configuration

Apps EBug: No Sleep Bug

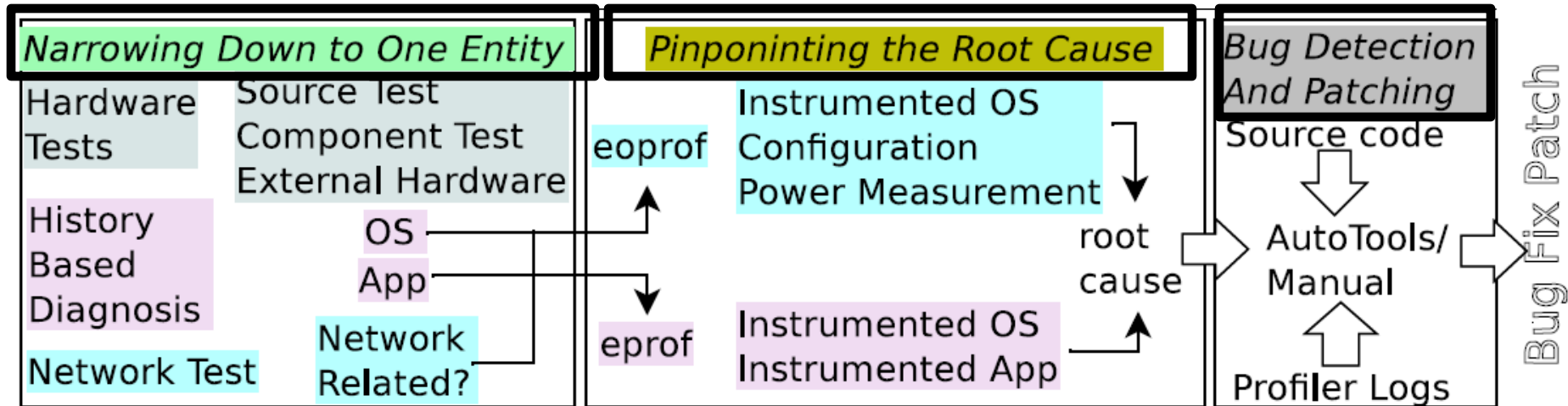
- **Aggressive Sleeping Policies:** Smartphone OSes freeze system after brief inactivity
- **Power encumbered Programming:** Programmer has to manage sleep/wake cycle of components
- **No Sleep Bug:** At least one component is kept awake due to mismanagement

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



at&t



verizon wireless

Hardware Manufacturers



SAMSUNG



snapdragon



QUALCOMM

App Developers



Google calendar



K-9
Best e-mail Client for
Android



Kernel Developers

Framework Developers



Firmware/OEM Developers



Windows
Mobile



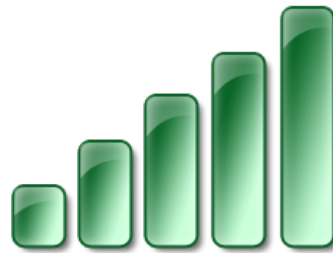
htc
smart mobility

Outline

- The Rise of Ebugs
- Debugging no-sleep Bugs
- Methods of Measuring Power Usage
- Power Models
 - Usage based
 - System call trace based
- Profiling
- Conclusion

Smartphones are Energy Constrained

Battery energy density only doubled in last 15 years



3G/4G



GPS



CPU



Screen



WiFi



Camera

Paradigm Shift in Power Management

- Desktop/Server/Laptop: Default ON
 - CPU turned off when idle for long time
- Smartphones: Default OFF
 - Smartphone OSes aggressively turn off Screen/CPU after brief user inactivity
 - Helps increasing standby time period

Consequences of Aggressive Sleeping Policy

```
public void DoNetwork ( )  
{
```

```
    Sync_Over_Network ( ); //Sync state with remote server  
                           //Can take up to a minute
```

```
}
```



- Background jobs
- User is not always touching phone

Need a mechanism to explicitly keep components awake.

Keep the screen on !

Android API to Explicitly Keep Components Awake

```
PowerManager pm = (PowerManager) getSystemService  
(Context.POWER_SERVICE);  
PowerManager.WakeLock wakelock= pm.newWakeLock  
(PowerManager.PARTIAL_WAKE_LOCK, null);
```

API	Component (s)
PARTIAL_WAKE_LOCK	CPU
SCREEN_DIM_WAKE_LOCK	CPU and Screen (DIM)
SCREEN_BRIGHT_WAKE_LOCK	CPU and Screen (Bright)
Camera.startPreview() Camera.release()	Camera

Android API to Explicitly Keep Components Awake (Cont'd)

```
public void DoNetwork ( ) {  
  
    wakelock.acquire ( );    //Don't let CPU sleep till I say so  
  
    Sync_Over_Network ( );    //Sync state with remote server  
                               //Can take up to a minute  
  
} wakelock.release ( );    //CPU is now free to sleep
```

iOS API to Explicitly Keep Components Awake

- Screen: **idleTimerDisabled** property in **UIApplication**
 - If NO, the idle timer turns off the device's screen after a specified period of inactivity
- GPS: enable/disable location updates, and set the distance filter and accuracy levels
 - Core Location uses the available GPS, cell, and Wi-Fi networks to determine the user's location
 - Core Location minimizes the use of these radios
 - Setting the accuracy and filter values gives Core Location the option to turn off hardware altogether in situations where it is not needed.
- WiFi: **UIRequiresPersistentWiFi** key in the app's Info.plist file
 - System will not shut down the Wi-Fi hardware while your app is running.

Power Encumbered Programming

App programmer has to manage sleep/wake cycle of components



NoSleep Energy Bugs

An error in smartphone app, where a component is woken up, **but not put to sleep**

Component	Impact (Google Nexus)
CPU	50-60% battery in 12 hrs
Screen	100% battery in 4-6 hrs
GPS	100% battery in 3-5 hrs

Collecting and Characterizing Bugs

- Online mobile forums



xdadevelopers



- Bug lists



- Open source code repositories

github
SOCIAL CODING



- Running the detection tool

Types of NoSleep Bugs

NoSleep Code Paths

NoSleep Race Conditions

NoSleep Dilations

(a) NoSleep CodePaths

At least one path in program wakes up a component but it to sleep



```
public void DoNetwork
```

```
{  
    try
```

```
    {  
        wakelock.  
        Sync_Over
```

```
        wakelock.release ( );
```

```
    } catch (SomeException e){
```

```
        Print.Error ( e );
```

```
    }  
}
```

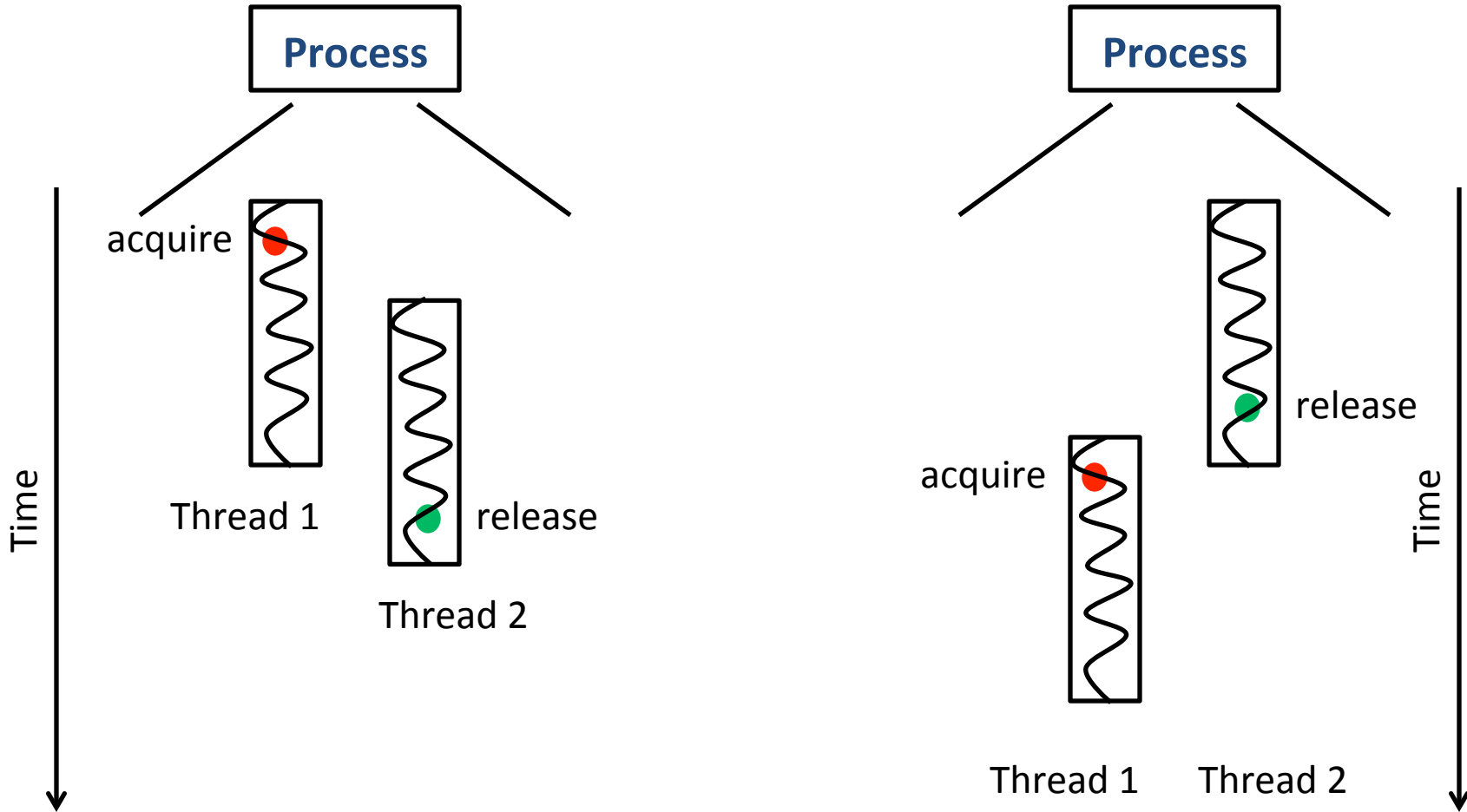
PU sleep till I say so

with remote server ;throws
to a minute ;exception

//CPU is now free to sleep

//Print Error for Debugging purposes

(b) NoSleep Race Condition (1)



(b) NoSleep Race Conditions (2)

```

public class MainThread
{
    boolean KillFlag = false; //Kill Flag
    wakelock.acquire ( ); //CPU C
    WorkerThread.start ();//start v
    .....
    .....
    .....
    KillFlag = true; //Kill the worke
    WorkerThread.interrupt();//stop worker
    wakelock.release ( ); //CPU can sleep now
    .....
    .....
}

public class WorkerThread
{
    .....
    .....
    .....
    NetSync(); //Critical Section
    wakelock.release ( ); //CPU can sleep
    Thread.Sleep (3 Mins);//Sleep for 3 mins
    wakelock.acquire ( ); //CPU Cant Sleep
    .....
}
    
```



Buggy Execution

(c) NoSleep Dilations

Components are eventually turned off but are kept on for unusually long duration of time

```
public void onCreate()  
{  
    wakeLock.acquire();  
}  
  
public long startNewTrack()  
{  
    + wakeLock.acquire();  
    ..  
}
```



Detecting NoSleep Bugs

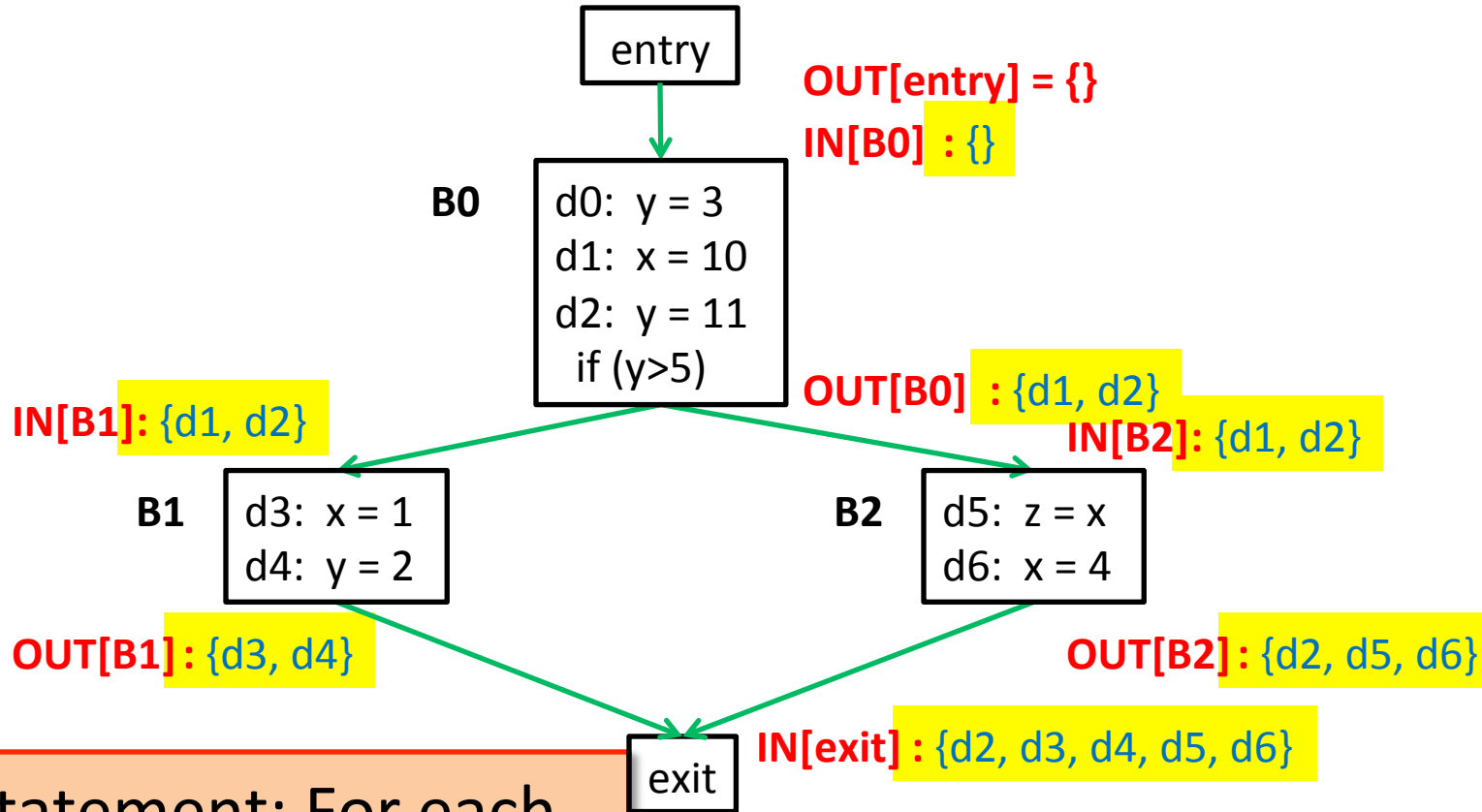
- NoSleep Code Paths
- NoSleep Race Conditions

- Static Data Flow Analysis
 - Reaching Definitions Data Flow Problem

Reaching Definitions Data Flow Problem

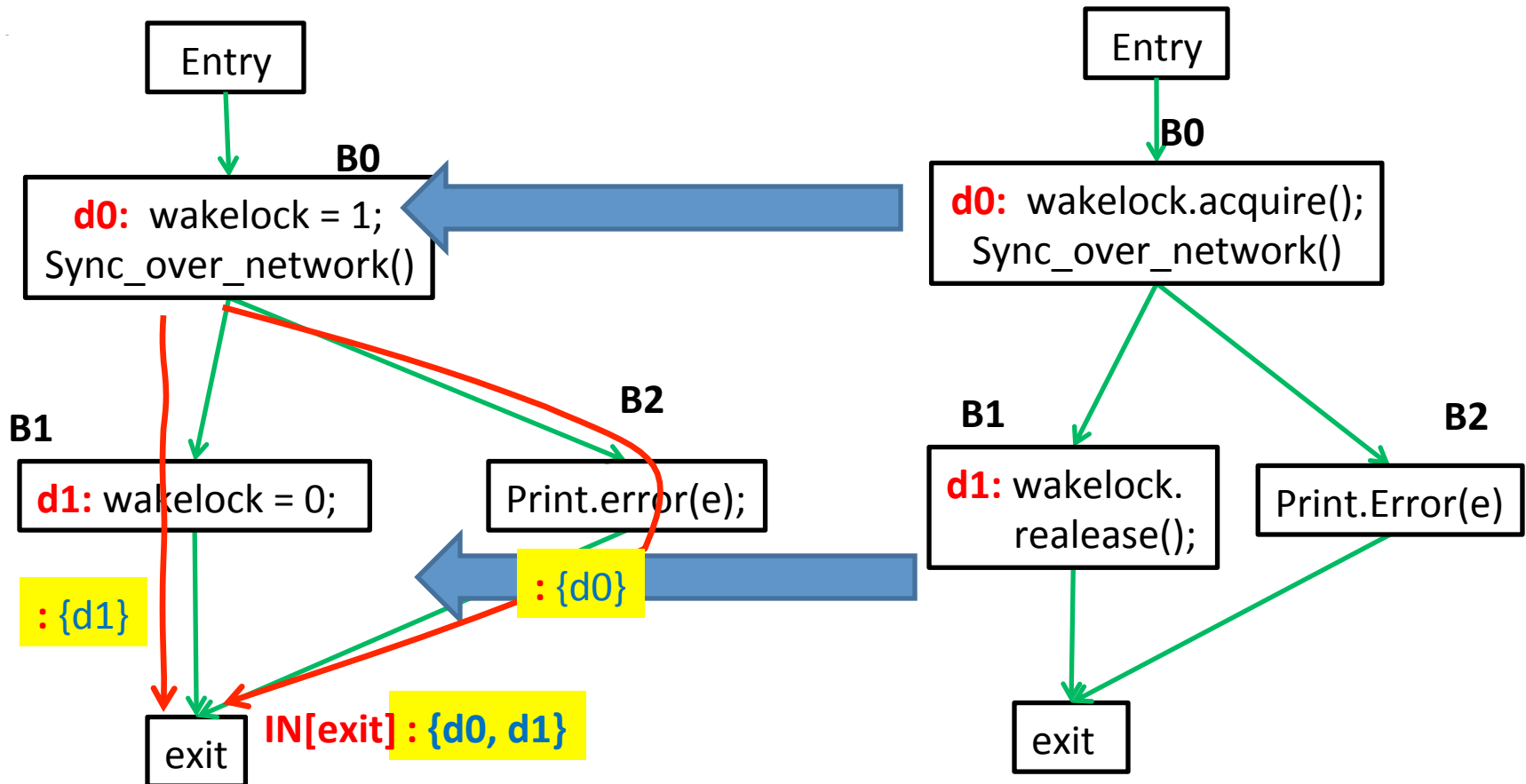
```
y = 3;  
x = 10;  
y = 11;
```

```
if( y > 5 ) {  
    x = 1;  
    y = 2;  
} else {  
    z = x;  
    x = 4;  
}
```



Problem Statement: For each point in the program, determine which definition of variable are reachable

NoSleep Code Path DataFlow Analysis



Apply reaching definitions to NoSleep CodePaths

Additional Details of Analysis in Paper

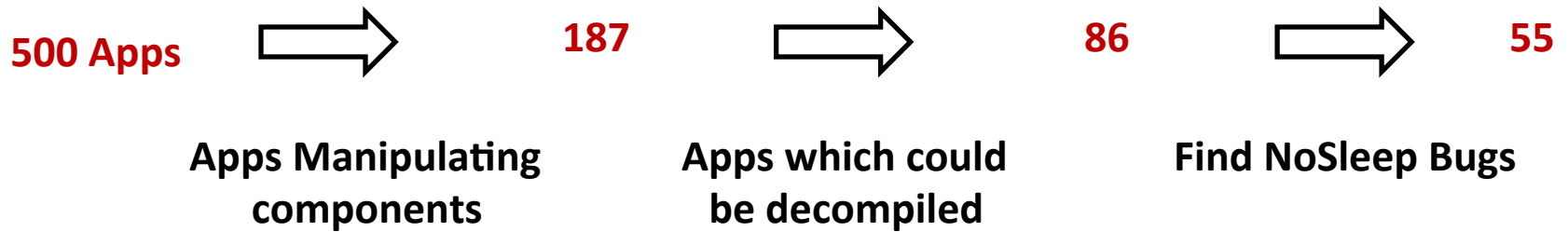
- Event based programming
- Java runtime issues
- Special code paths: reducing false positives
- Multi-threaded programs

Implementation

- Soot Implementation
 - Open source framework for analyzing java bytecode from Sable research group at McGill University
 - Added ~2 KLOC

- Runs on Java byte code
 - No need for source code

Evaluation: NoSleep Code Paths

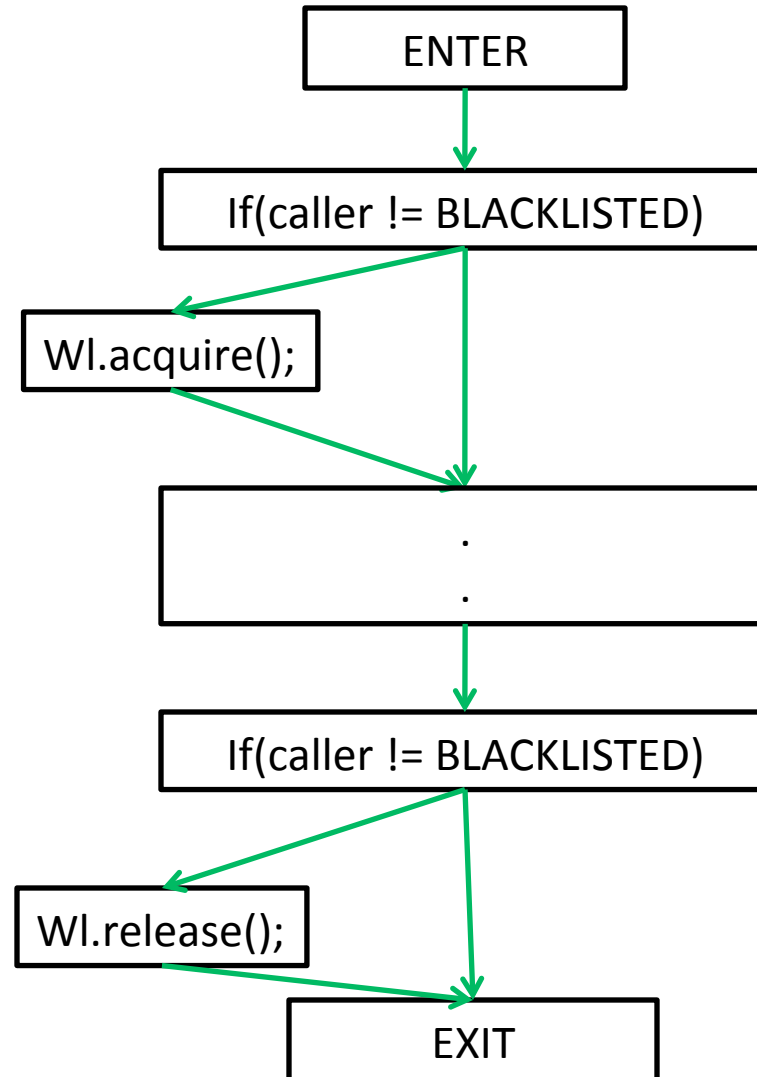


Total Apps 86	BUG in reality	No BUG in reality
Tool reports BUG (55)	True Positive 42	False Positive 13
Tool reports no BUG (31)	False Negative 0	True Negative 31

Causes of Detected NoSleep Bugs

Category	Number of Apps	Examples
Incorrect Wakelock Handling in Events	26	MyTracks
If, else + exception Paths	12	Facebook
Forgot Release	4	K9Mail

Common Cause of False Positives



Summary

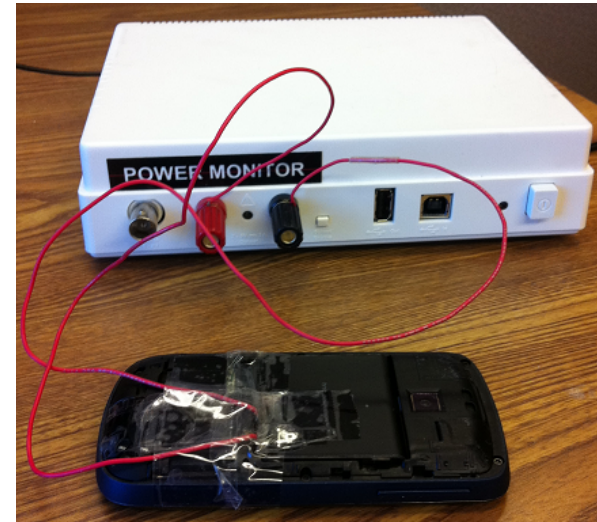
- Paradigm shift in power management
 - Power encumbered programming
- NoSleep energy bugs
 - Code paths, race, dilation
- Reaching definition data flow analysis
 - Found 30 new previously unreported bugs

Future Work

- Comprehensive approaches to No-Sleep bug
 - Detection: e.g. Symbolic execution
 - Prevention: e.g. Better abstraction for power management API
 - Mitigation: e.g. Runtime detection, Limiting damage of the bug

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`

Outline

- The Rise of Ebugs
- Debugging no-sleep Bugs
- Methods of Measuring Power Usage
- **Power Models**
 - Usage based
 - System call trace based
- **Profiling**
- **Conclusion**

Smartphone is Energy Constrained

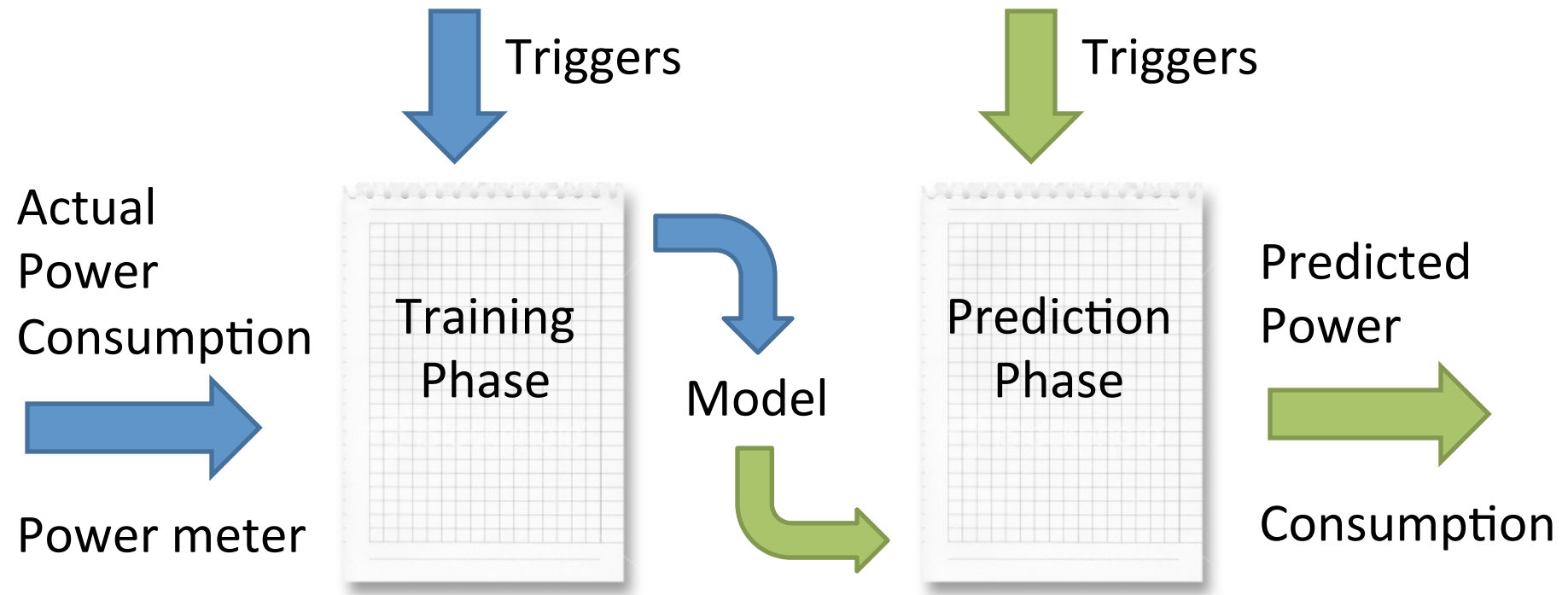
- Energy: One of the most critical issues in smartphones
 - Limited battery lifetime
- Battery energy density only doubled in last 15 yrs
- Smartphone capability has increased drastically
 - Multiple Components: GPS, 3G, retina display,



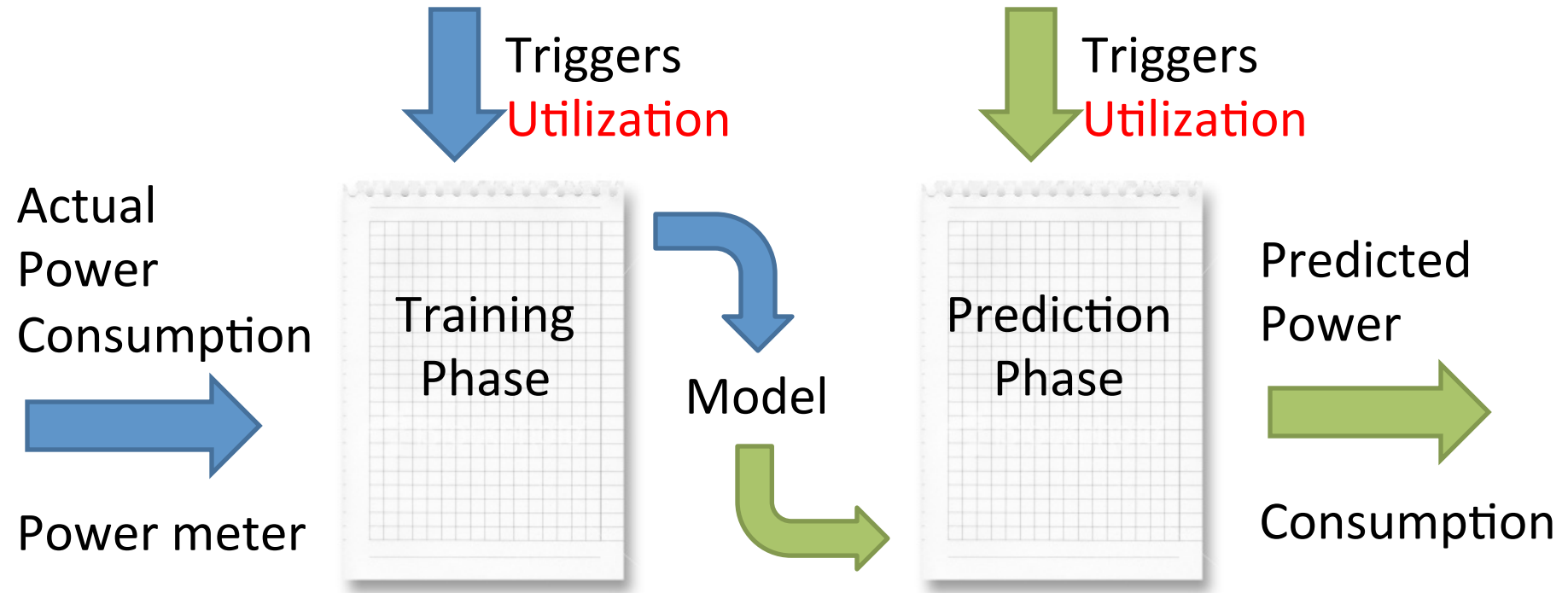
Towards Understanding Energy Drain

- 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

$$\begin{aligned} & (\beta_{uh} \times freq_h + \beta_{ul} \times freq_l) \times util + \beta_{CPU} \times CPU_on + \beta_{br} \times brightness \\ & + \beta_{Gon} \times GPS_on + \beta_{Gsl} \times GPS_sl + \beta_{Wi-Fi_l} \times Wi-Fi_l \\ & + \beta_{Wi-Fi_h} \times Wi-Fi_h + \beta_{3G_idle} \times 3G_idle + \beta_{3G_FACH} \times 3G_FACH \\ & + \beta_{3G_DCH} \times 3G_DCH \end{aligned}$$

β : 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



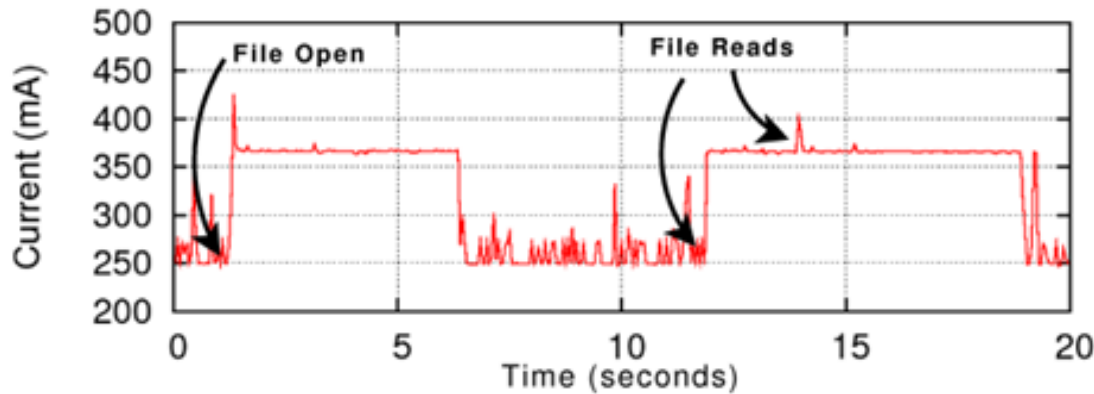
Desired Feature

Which process/thread/function? Hard to correlate

(Only active) Utilization => Power Consumption



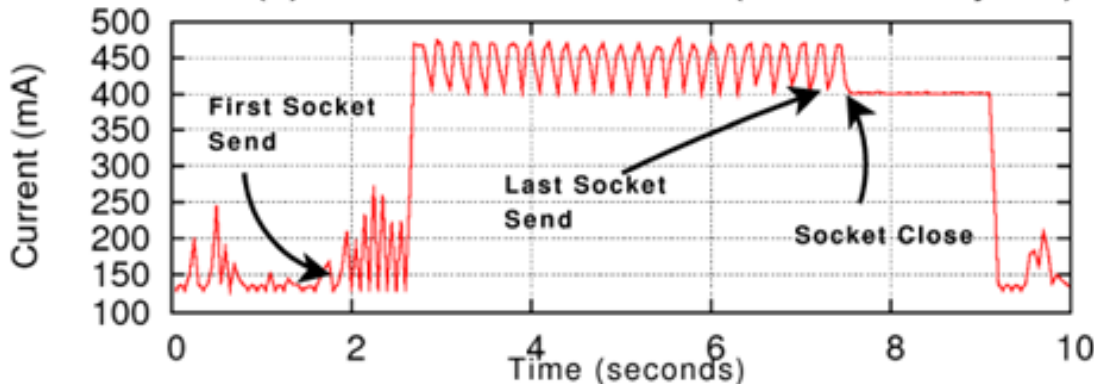
(a) File Open and Read (on WM6 on Touch)



File open/delete/
close/create
change power state



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

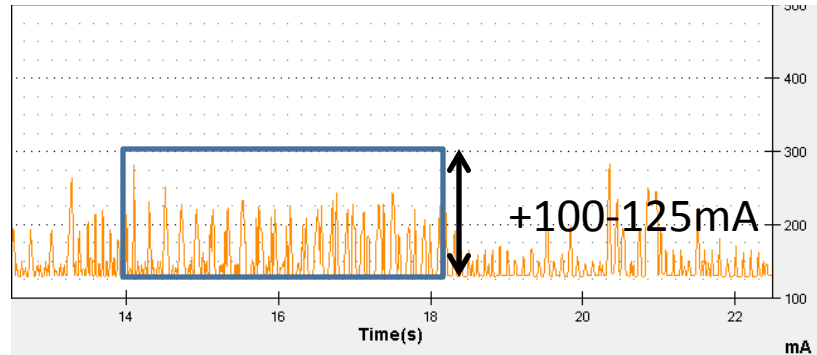


Several components
have tail states
(3G, disk, wifi, gps)

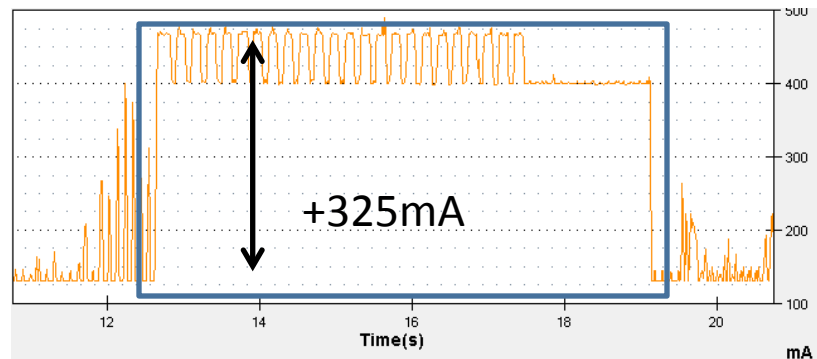
Energy scales linearly with amount of work



WM6.5 on Tytn II



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

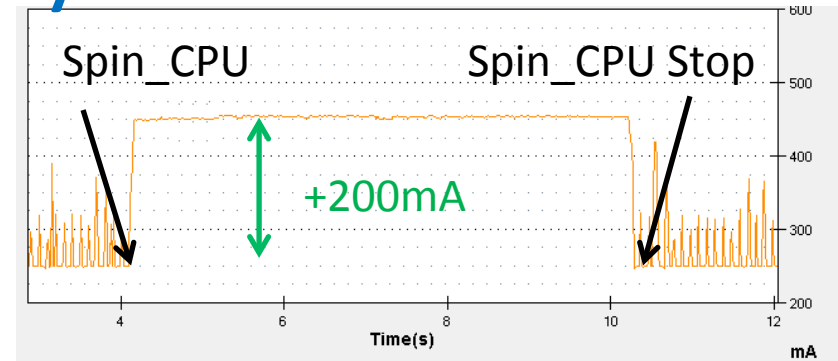
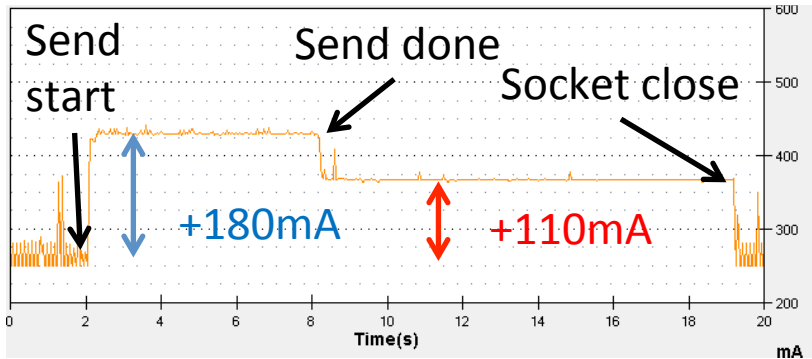


- (2) Send packets @ > 50 pkts/s

Components power consumption add

linearly

WM6.5 on HTC Touch



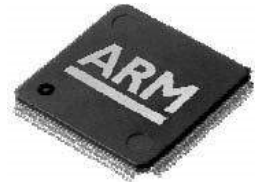
(1) Send(10mb);
sleep();
Socket.close();

Spin_CPU(2M)
(i = 1)

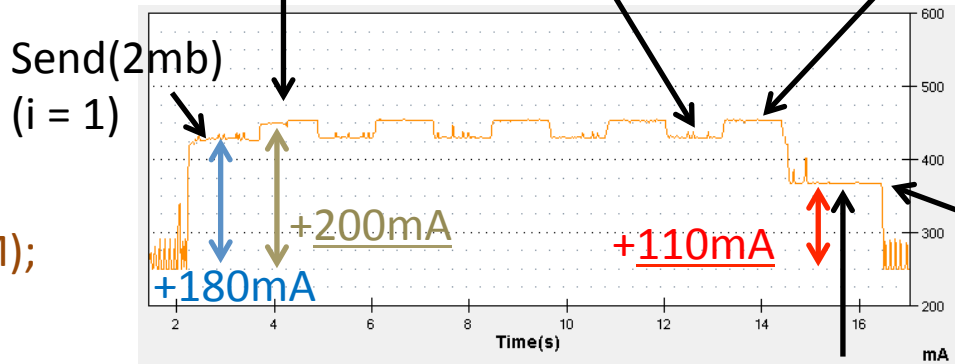
Send(2mb)
(i = 5)

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

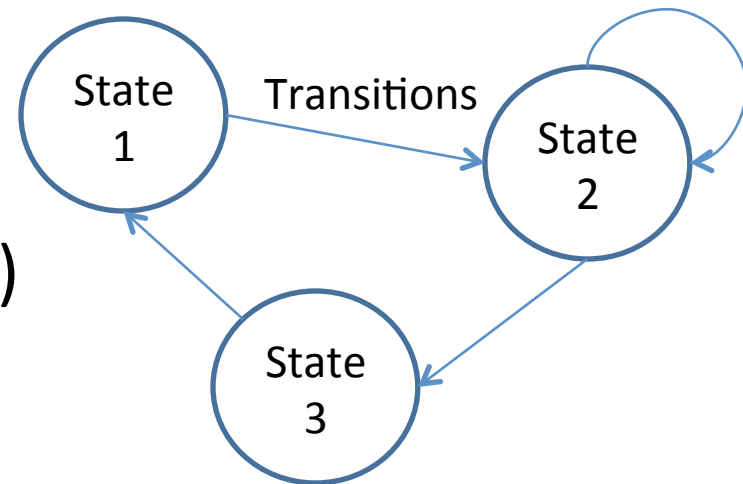
Advantages:

- 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

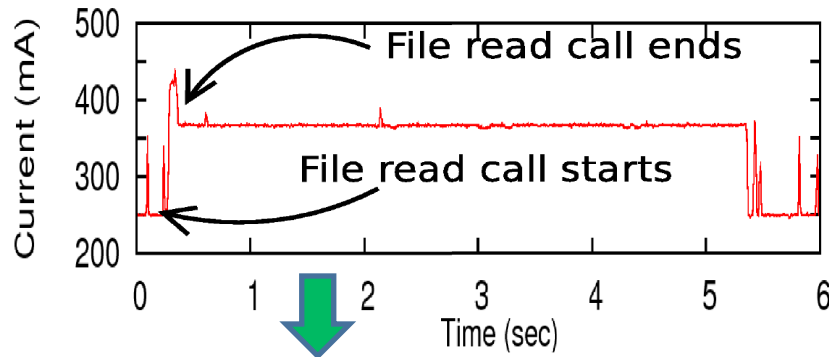
- Systematic 'Brute Force' Approach
 - Step 1 : Model Single System Call
 - Step 2 : Model Multiple System Calls for Same Component
 - Step 3 : Model Multiple Components (Entire Phone)
- Requires domain knowledge
 - Semantics of system calls

Step 1: Single System Call FSM

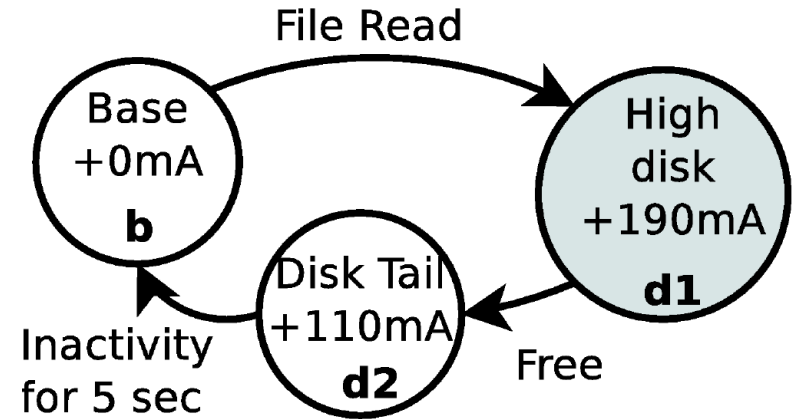
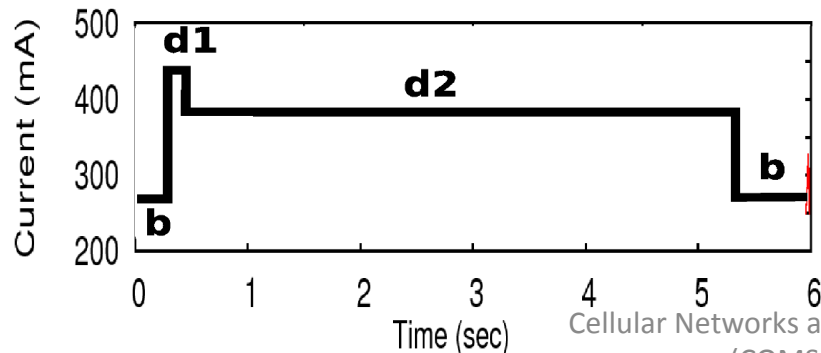
WM6.5 on HTC Touch

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

Measured power consumption + system calls (trigger)



Modeled power consumption



FSM

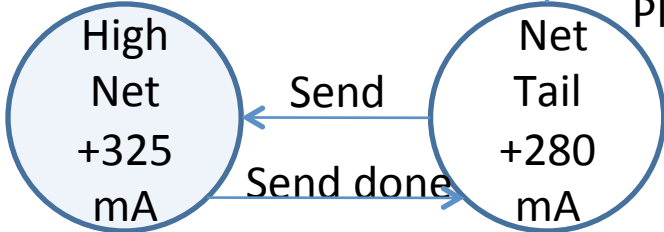
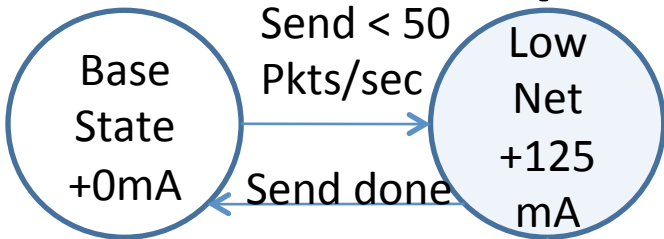


Step 2: Modeling Multiple System Calls of Same Component

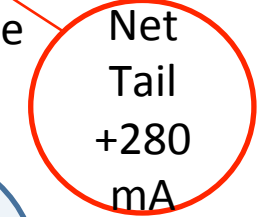
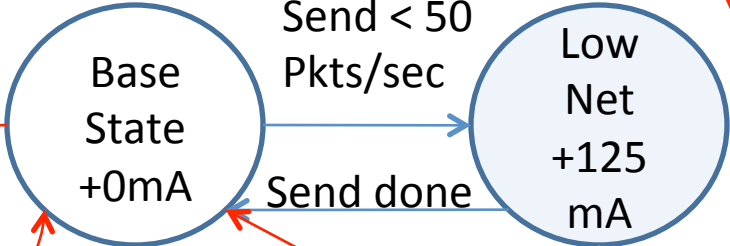
- Observation: A component can only have a small finite number of power states
- Methodology
 - Identify and merge similar power states
 - Obey programming order
 - Model concurrent system calls

Step 2: WiFi NIC

SEND

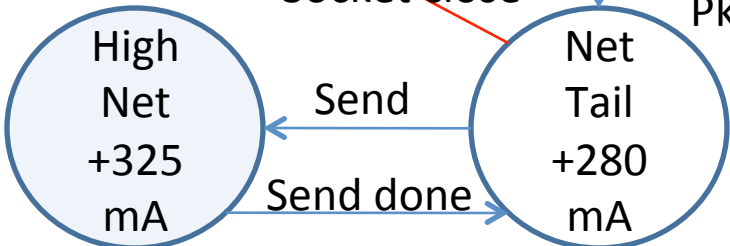


Send > 50 Pkts/sec



CLOSE

Socket close



Socket close

Send > 50 Pkts/sec

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

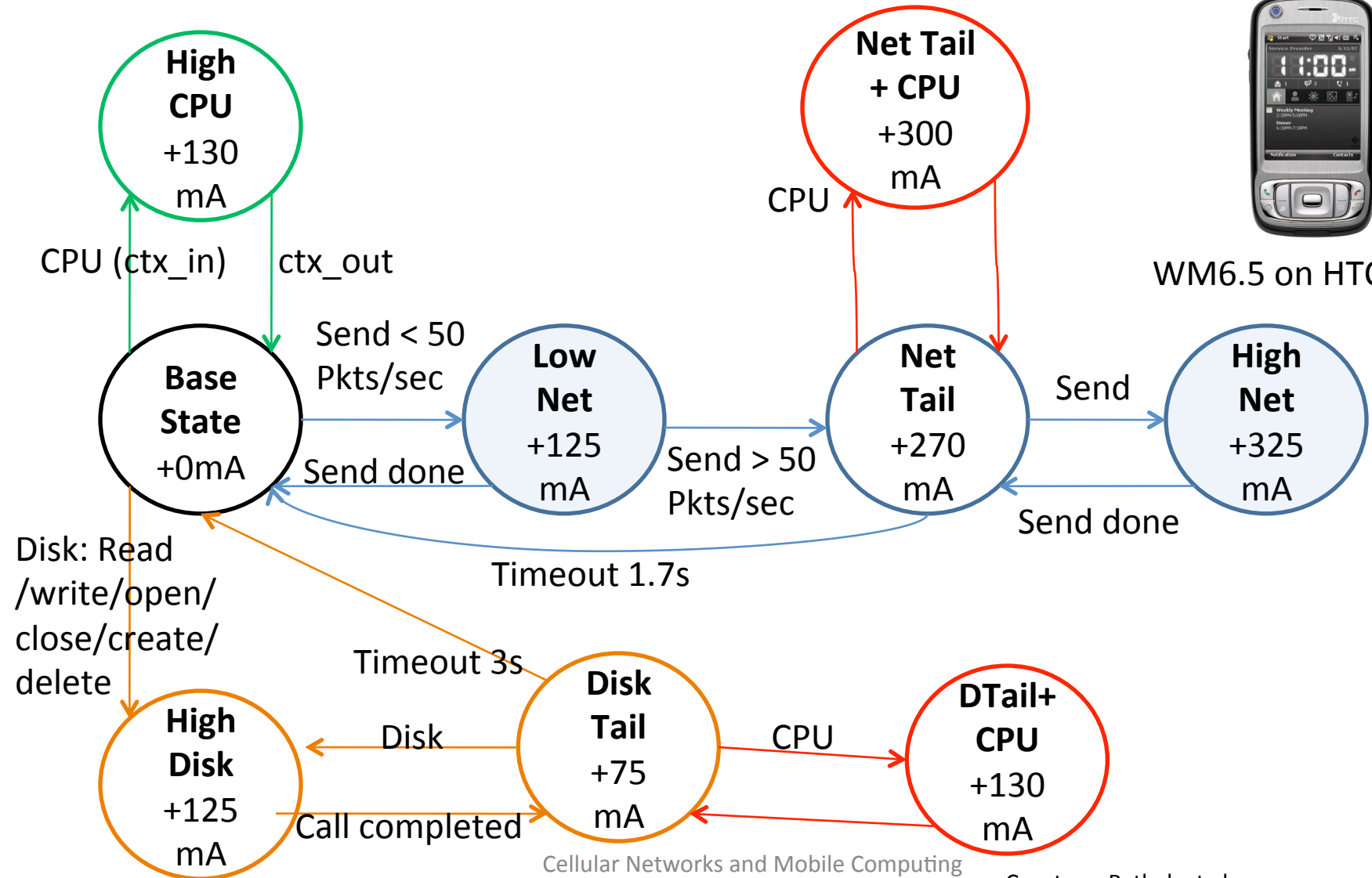
Android (Linux 2.6.34)



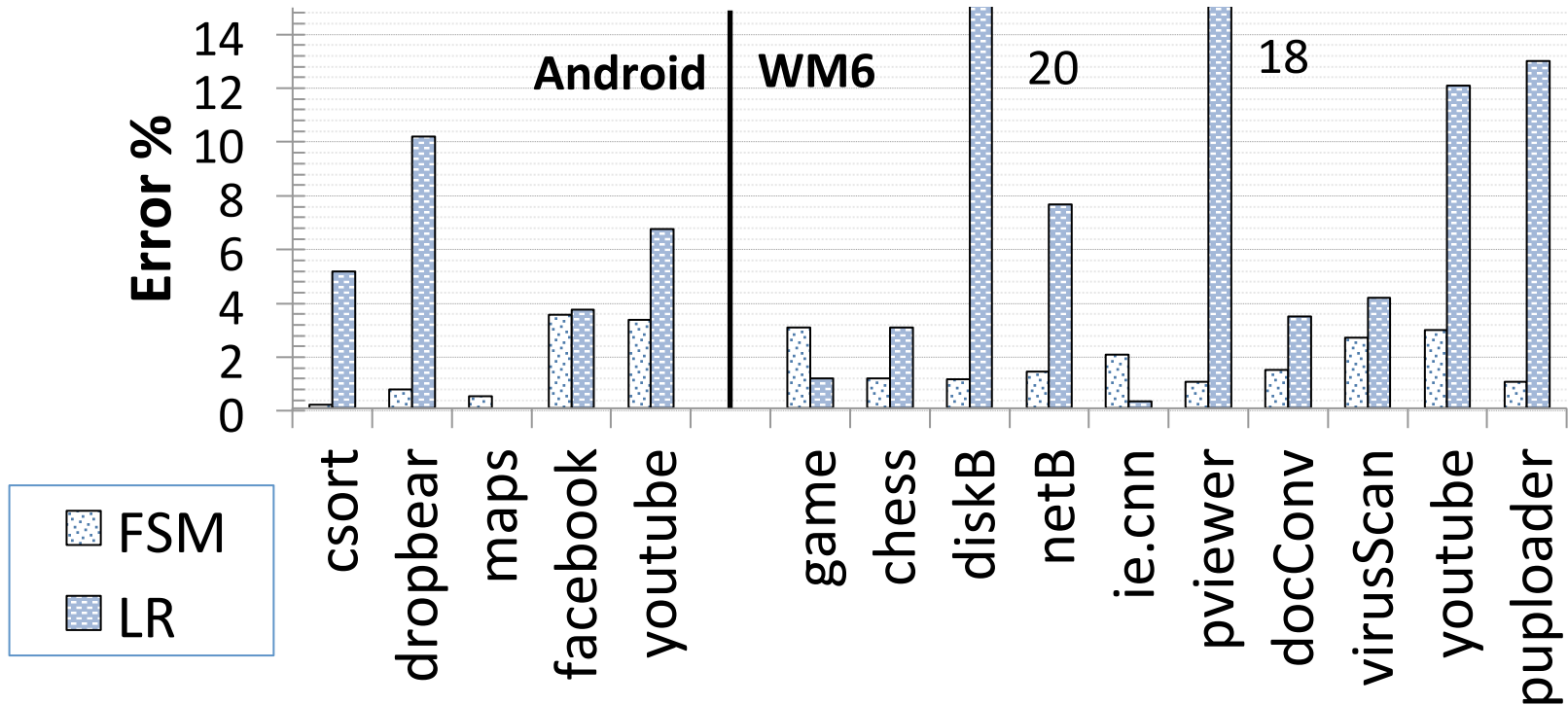
Snapshot of FSM for Entire Phone



WM6.5 on HTC Tytn II



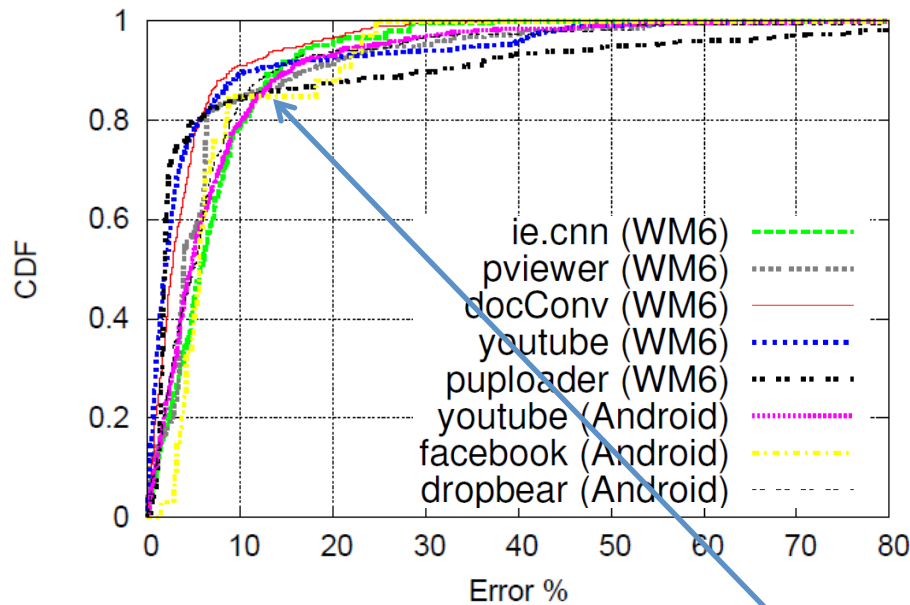
End-To-End Energy Estimation Error



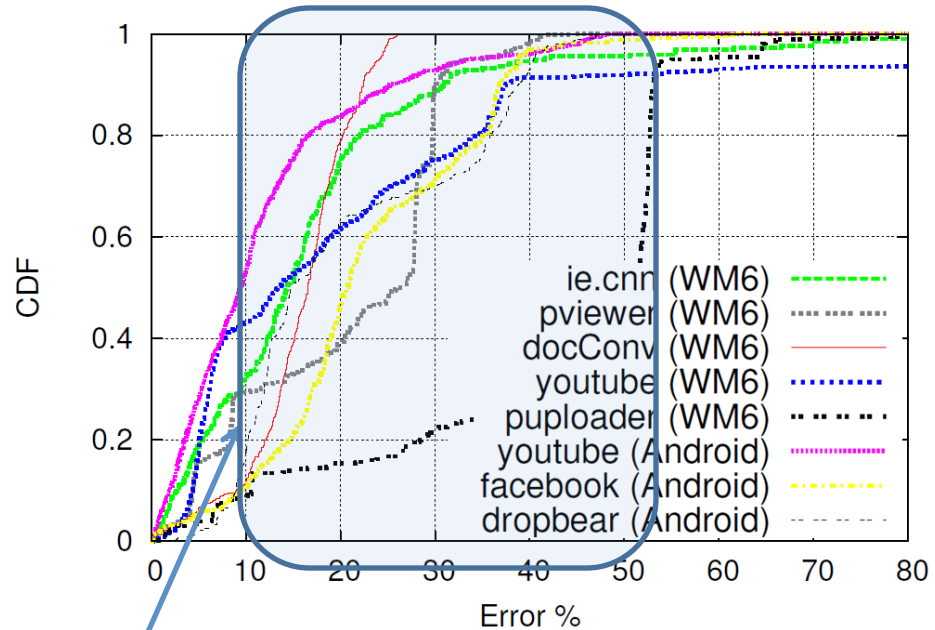
FSM: under 4%
LR: 1% – 20%

Fine-Grained Energy Estimation

CDF of energy estimation error per 50ms time interval



FSM based on System calls



Linear Regression (State-of-art)

FSM: 80th percentile error less than 10% for all apps
LR: 10th percentile error less than 10% for all apps

Outline

- The Rise of Ebugs
- Methods of Measuring Power Usage
- Power Models
 - Usage based
 - System call trace based
- **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)

Towards Energy Profiling

- Performance

- Energy: One of the most critical issues in smartphones
- Battery energy density only doubled in last 15 yrs



1970's-80's

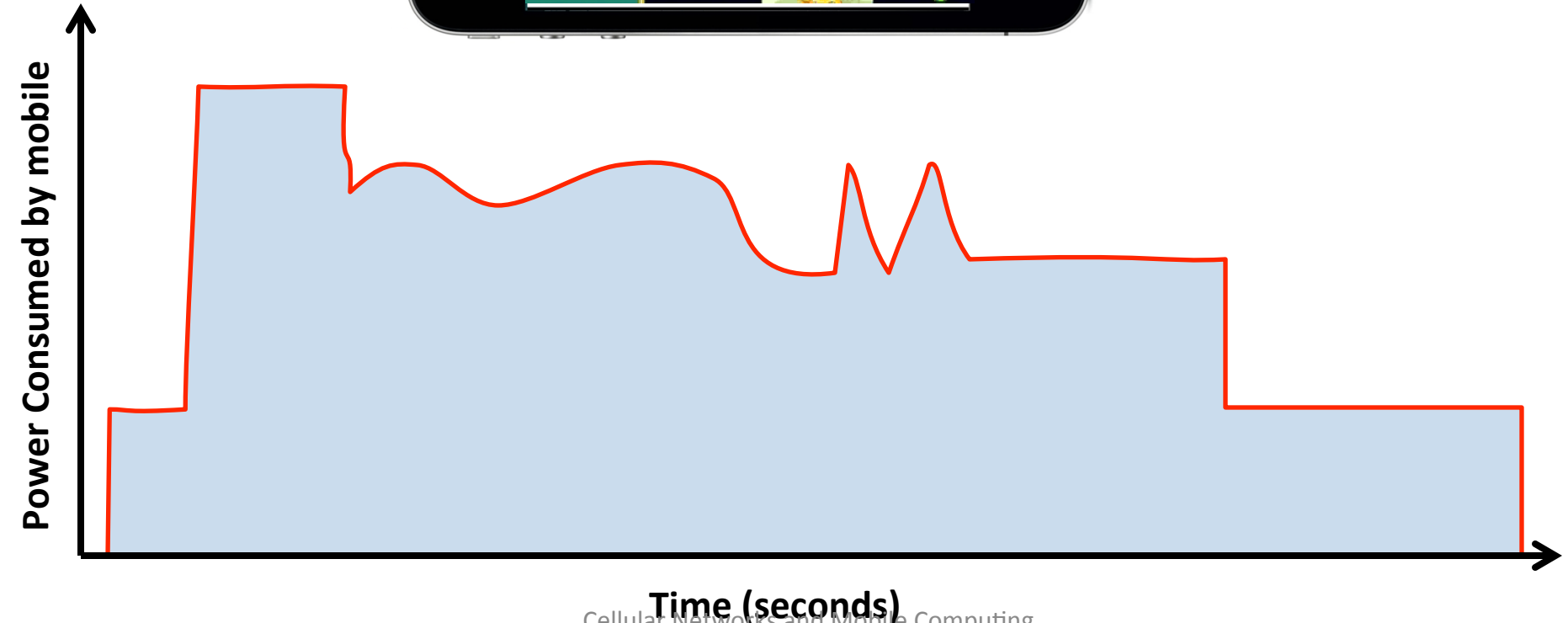
2010

**Gnu Profiler
(gprof PLDI'82)**

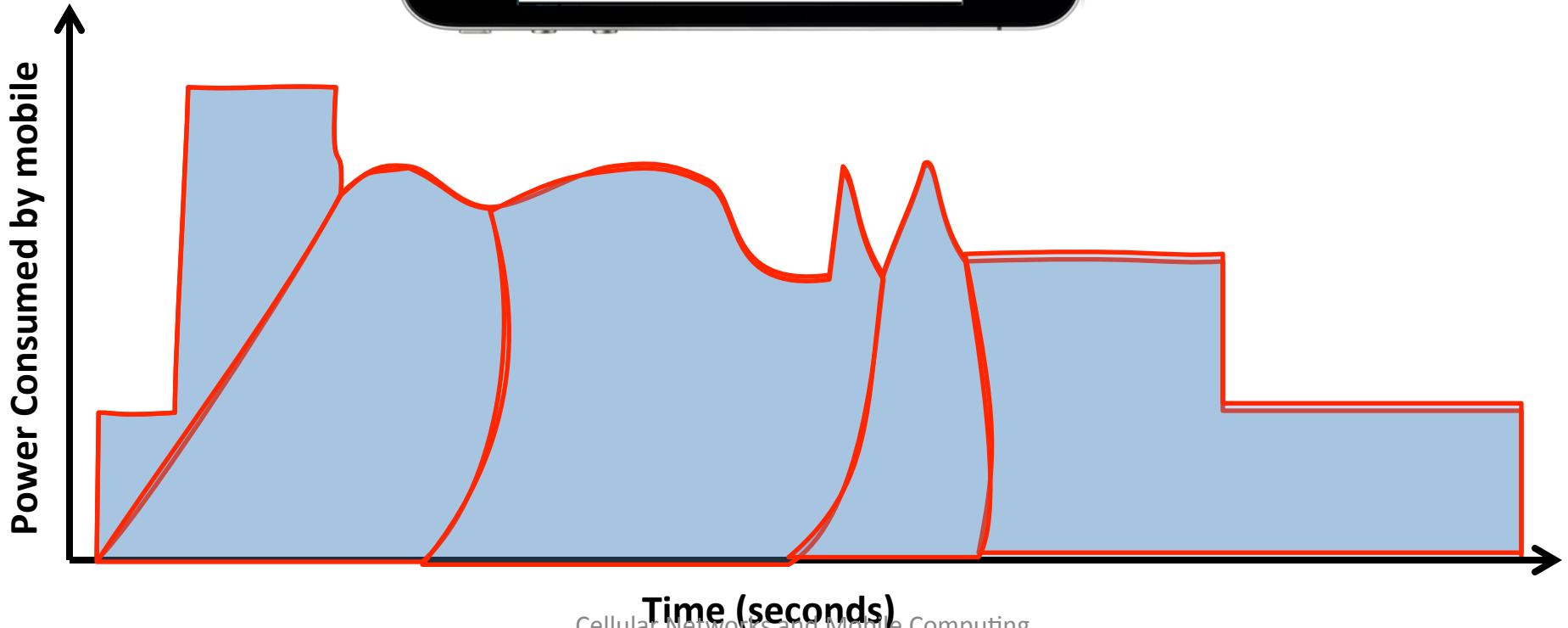
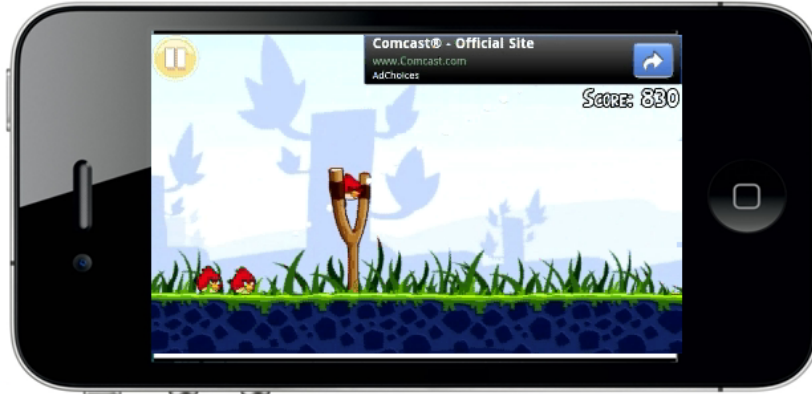
Energy Profiler...?



Approach (a) : Power Meters



Approach (a) : Power Meters



Approach (b) : Software Energy Profiling

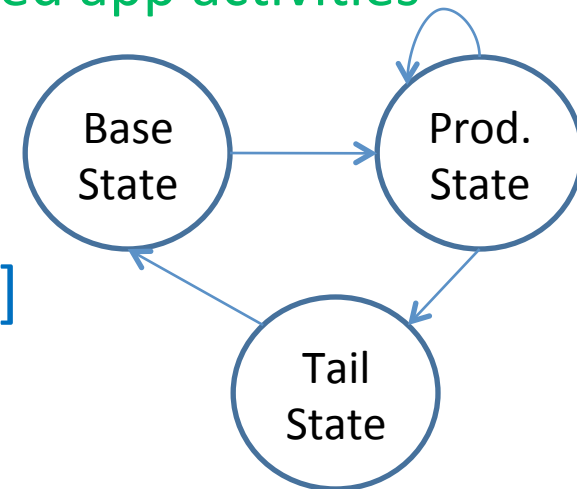
- Tracking power activities
- Tracking app activities
- Mapping power activities to app activities

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

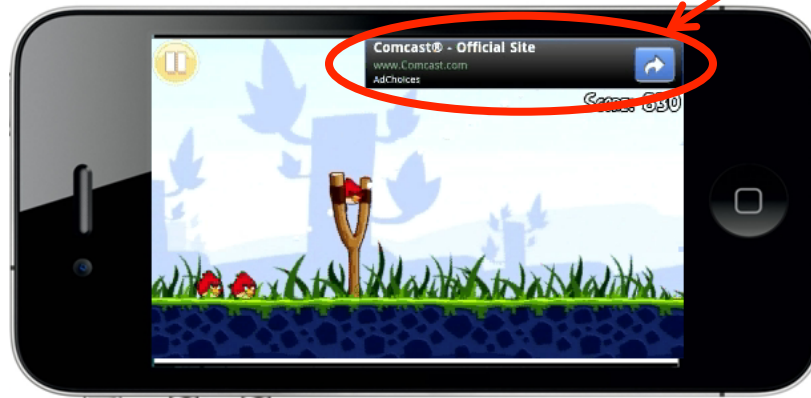
- System call triggered FSM based fine-grained power model [Eurosys '11]
 - Use system calls as power triggers
 - System calls drive Finite-State-Machine



Tracking App Activities

- Granularity of Energy Accounting

Multi Threading:



Third Party Ad Module



Multi Processing:



Multiple Routines:

- Collect information
- Upload information
- Download ads

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

Where is Energy Spent Inside My App?



Tracking power activities

- System call based online power model



Tracking app activities

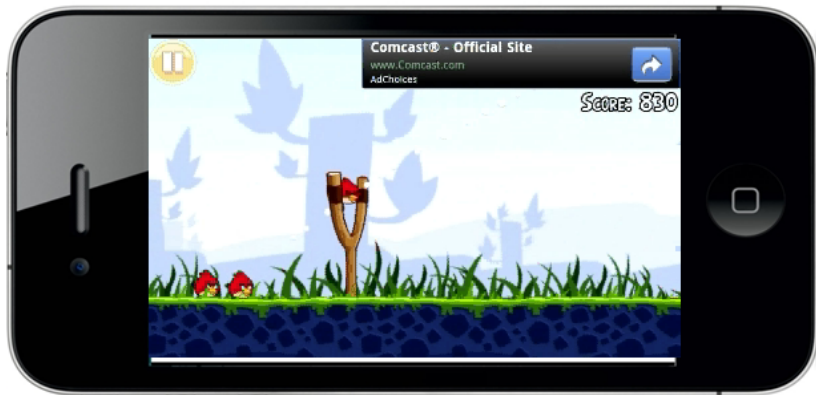
- IO: Backtrace system calls
- CPU: Just like gprof [PLDI '82]

- Mapping power activities to app activities
 - Accounting Policy: Lingering Energy Consumption

Lingering Energy Consumption

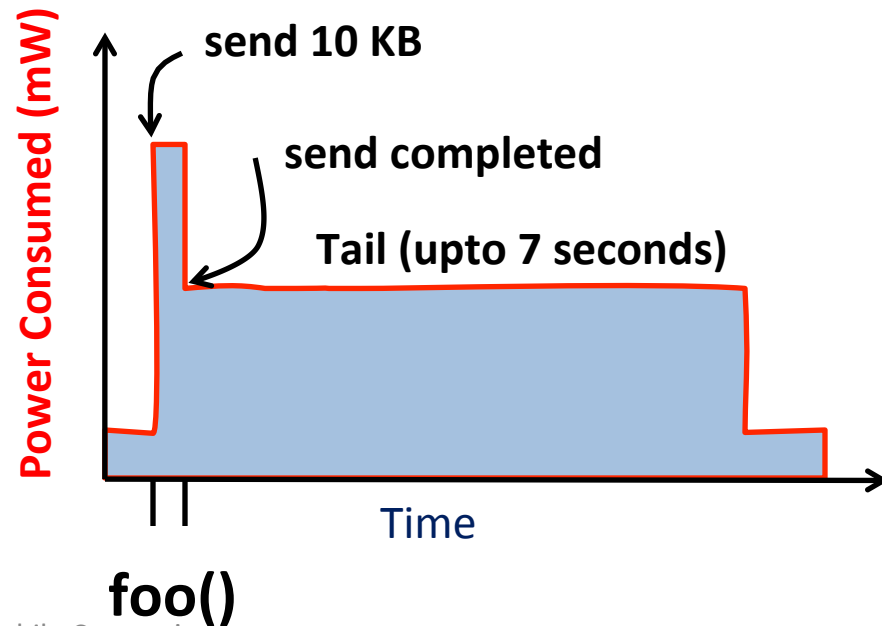
(a) Tail Energy

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



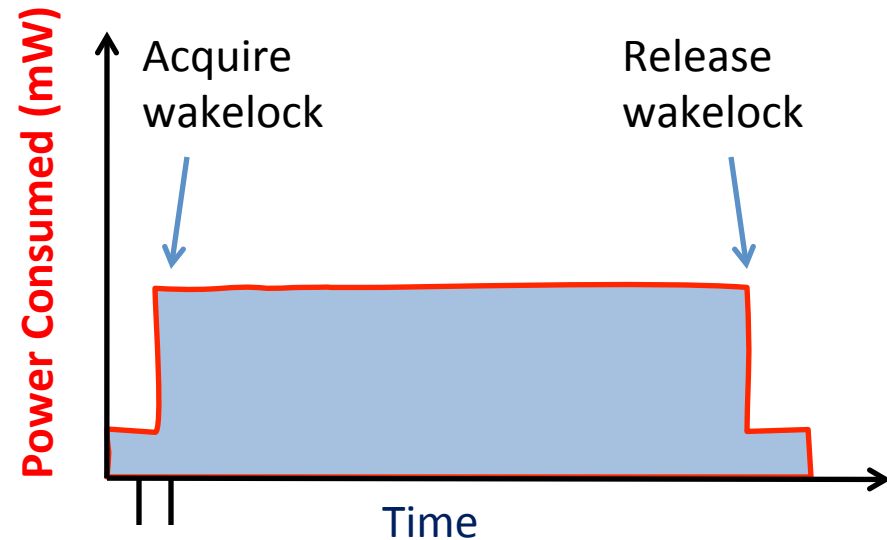
Lingering Energy Consumption

(b) Persistent State Wakelock

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

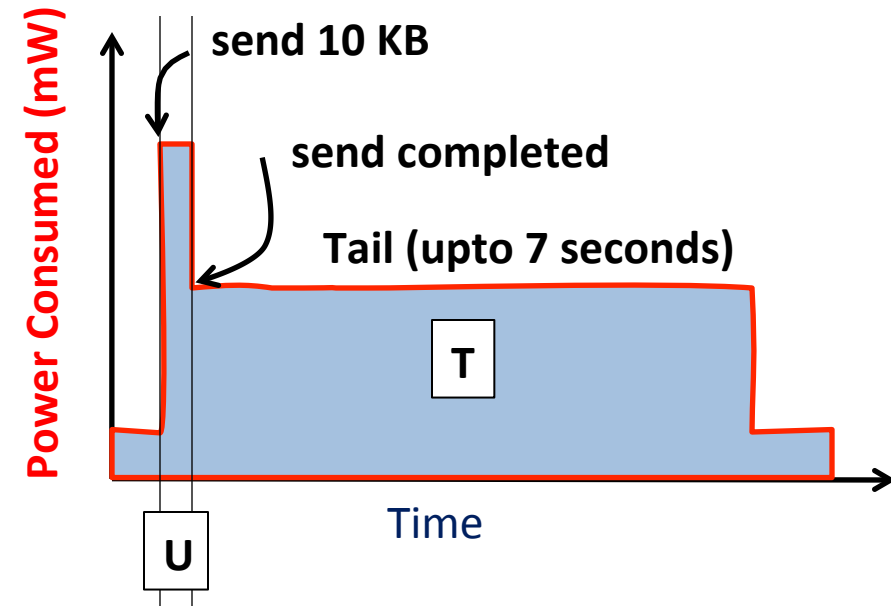


Keep the screen on !



Lingering Energy Consumption

Case 1: Single Call Single Tail

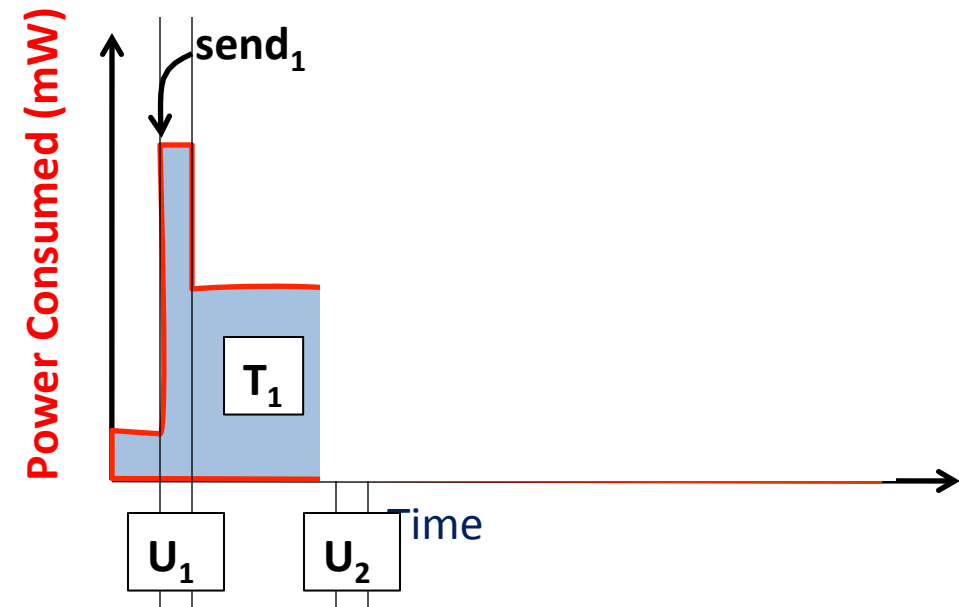


1. Energy represented in terms of an energy tuple (U, T)
2. (U, T) is attributed to entity (s) containing send system call

Lingering Energy Consumption

Case 2: Multiple Calls Multiple Tails

How to split tail T_2 among?



Average Policy: Split tail energy T_2 in weighted ratio

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

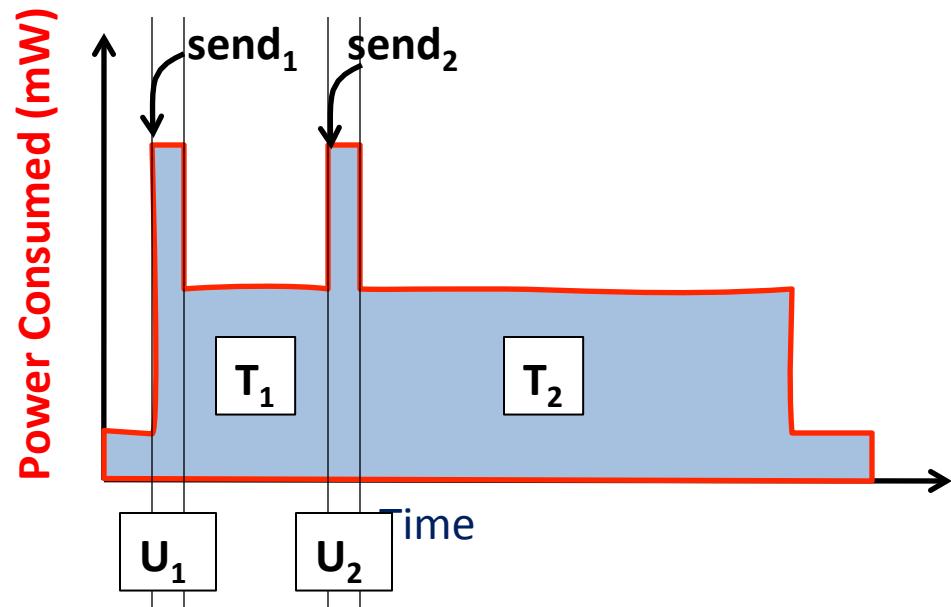
Lingering Energy Consumption

Case 2: Multiple Calls Multiple Tails

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

$\text{send}_1 : (U_1, T_1)$

$\text{send}_2 : (U_2, T_2)$



- ~~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

eprof Implementation

- SDK routine tracing: extend Android routine 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/>

```
AndroidManifest.xml
```

```
<uses-permission  
android:name="android.permission.WRITE_EXTERNAL_STORAGE"  
"/>
```

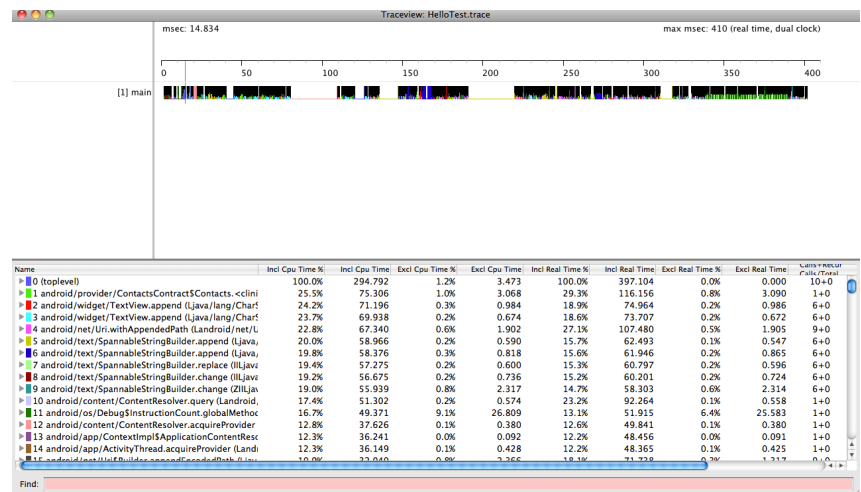
```
MainActivity.java
```

```
import android.os.Debug;
```

```
---
```

```
public void onCreate(Bundle savedInstanceState) {  
...  
Debug.startMethodTracing("HelloTest");  
...  
Debug.stopMethodTracing();  
}
```

```
adb pull /mnt/sdcard/HelloTest.trace .  
traceview HelloTest.trace
```









eprof Implementation (Cont'd)

- Augmented TraceView in Dalvik
 - gprof-like tracing + syscall tracing
- eprof API: *StartEnergyTracing()*
StopEnergyTracing()
 - Needs app recompile

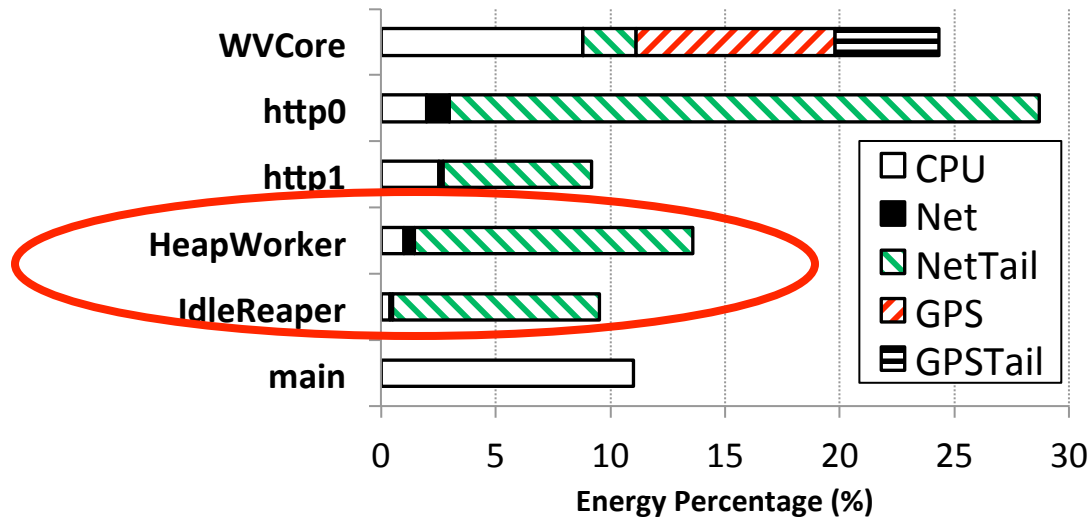


Modified Android framework to trace each app by default
(no need for app source)

Using eprof

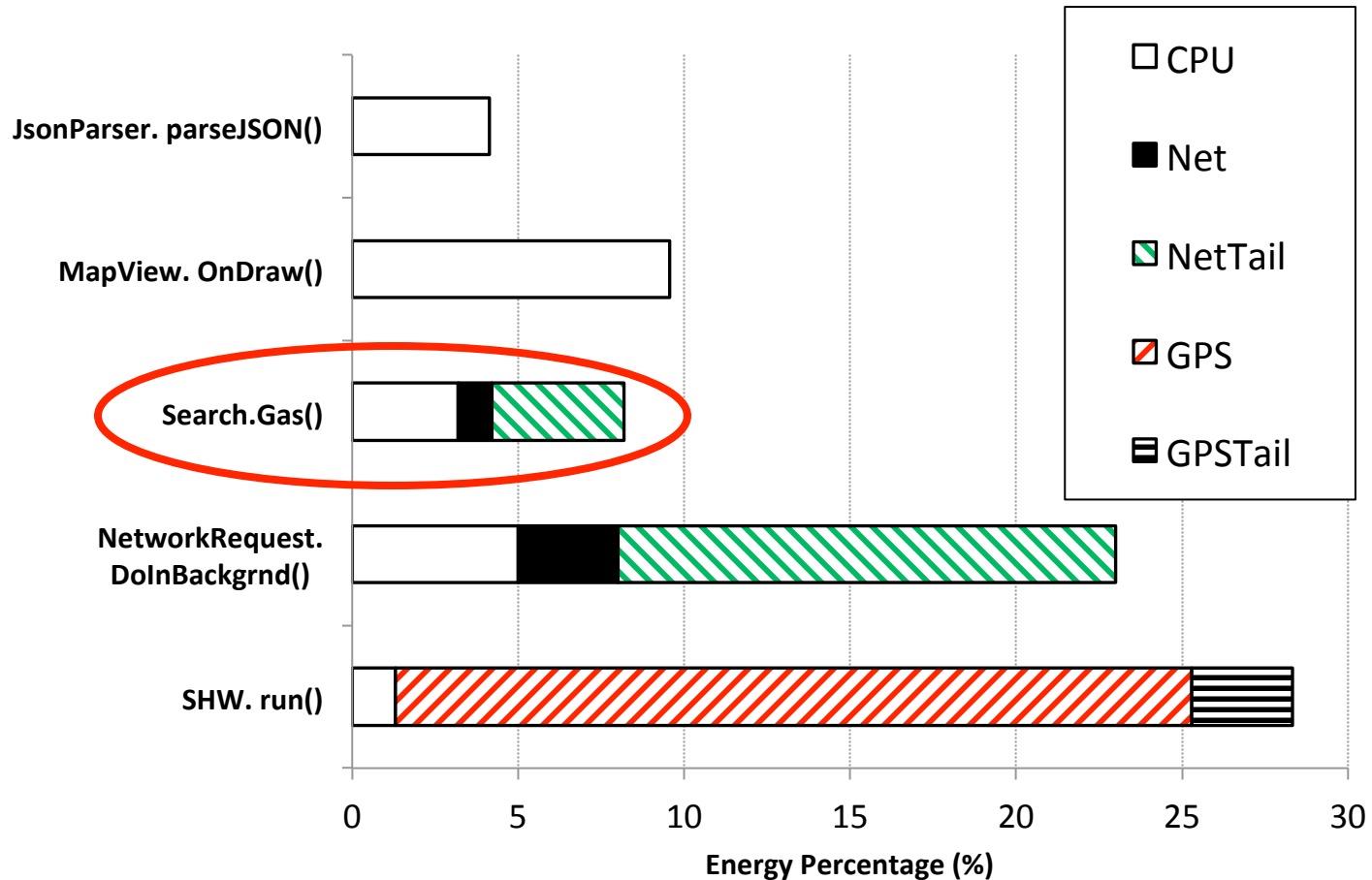
App	Num Routine calls	Num Threads	3 rd Party Modules
Browser	1M	34	--
AngryBirds	200K	47	 
FChess	742K	37	
NYTimes	7.4M	29	
MapQuest	6M	43	 

Case Studies: (a) Android Browser Google Search




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

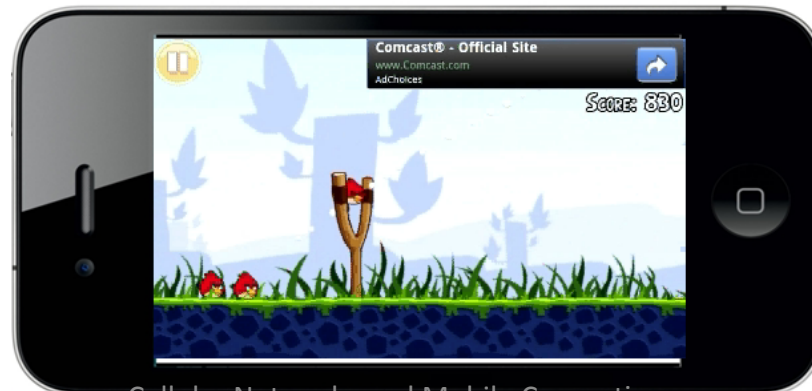
Case Studies: (b) Map Quest



Case Studies: (c) – Angry Birds

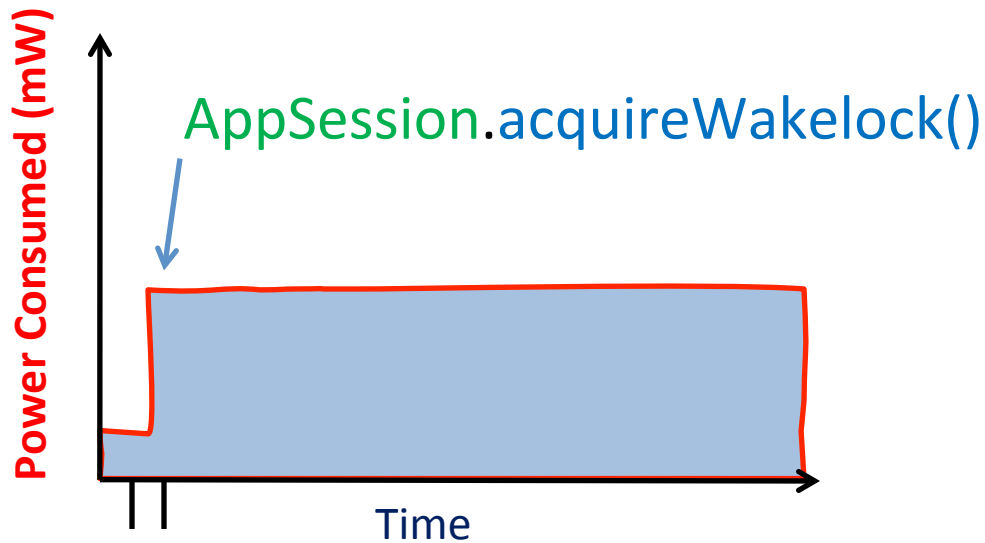
Google Nexus (3G)

Activity	Energy %
 User Tracking & Uploading Information	45%
Fetching Ads	28%
Game Play	20%



Case Studies (d): 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

- IO energy is spent in bursts, called bundles
 - A bundle is defined as a continuous period where IO component actively consumes energy
 - Very few IO bundles per app

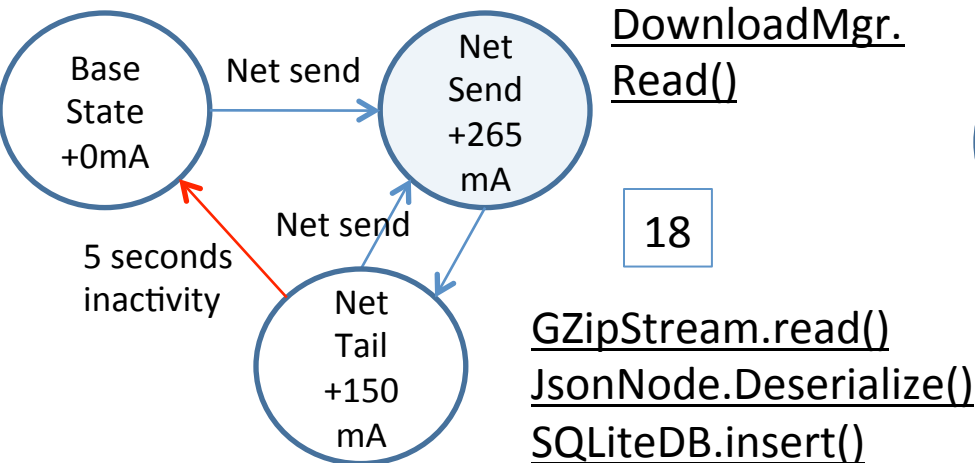
Power Consumed (mW)

% of Total Energy

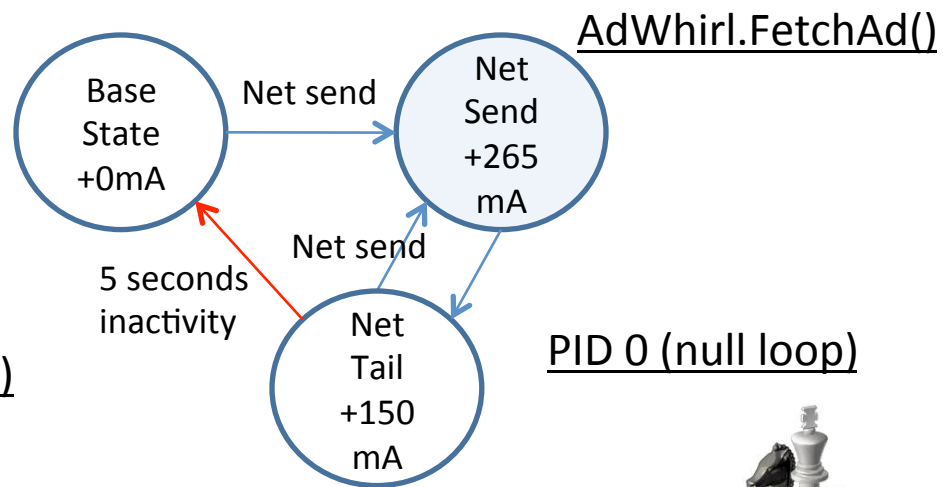
Browser AngryBirds Fchess NYTimes Mapquest Photo Upload

Optimizing IO Energy using Bundles

Why is a bundle so long?



Why are there so many bundles?



The New York Times
ON THE WEB



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

Summary

- 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

Conclusion and Future work

- Ebugs need to be dealt with
 - No-sleep ebug debugging studied
- 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

- Soot: open source framework for analyzing java bytecode
 - <http://www.sable.mcgill.ca/soot/>
- ded: decompiling android application tool
 - <http://siis.cse.psu.edu/ded/>
- SDK routine tracing
<http://developer.android.com/reference/android/os/Debug.html>
- gprof: NDK routine tracing
 - <http://code.google.com/p/android-ndk-profiler/>
- systemtap: system call tracing

Questions?