

# WiPLUS

## Towards LTE-U Interference Detection, Assessment and Mitigation in 802.11 Networks

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- Impact of LTE-U on WiFi,
- Problem Statement,
- WiPLUS
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  - Implementation,
- Experiment Evaluation,
- Conclusion.

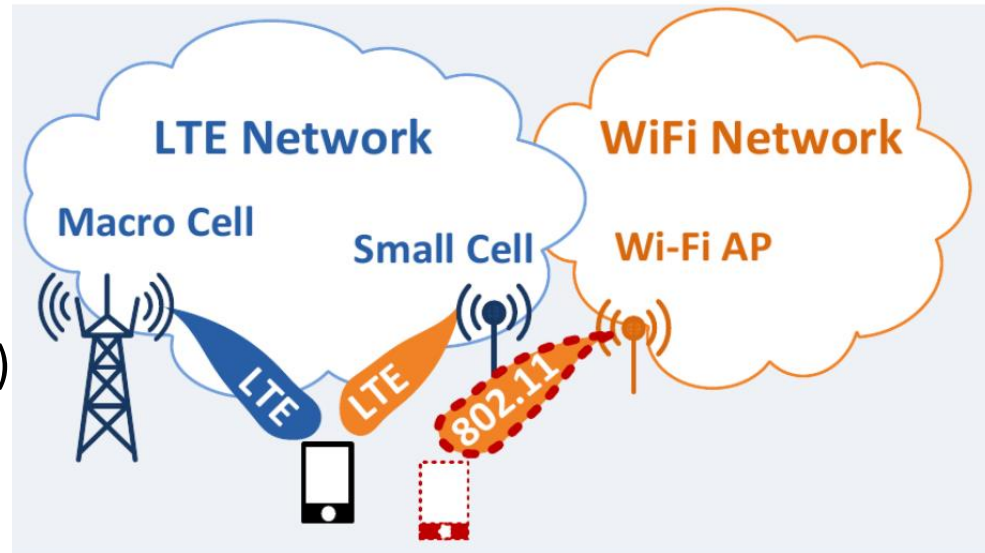
# Motivation

- **Rapid growth** in the use of wireless devices such as smart phones and appearance of **novel applications** like multimedia streaming applications & cloud storage.
- **WiFi** is the **dominant access technology** in residential/enterprise environments and there is strong trend towards further **densification**,
- **5 GHz ISM band** is being used by current 802.11 and future standards (.11ax).
- “**LTE in Unlicensed**” (LTE-U) constitutes a new source of interference with strong impact on WiFi in 5 GHz spectrum,
- **WiFi** will suffer **performance issues** due to *insufficient free radio spectrum* resulting in high contention/interference.



# LTE Unlicensed Primer

- **LTE**
  - licensed spectrum (exclusive)
  - scheduled channel access
- **WiFi**
  - unlicensed spectrum (shared)
  - random channel access (CSMA).

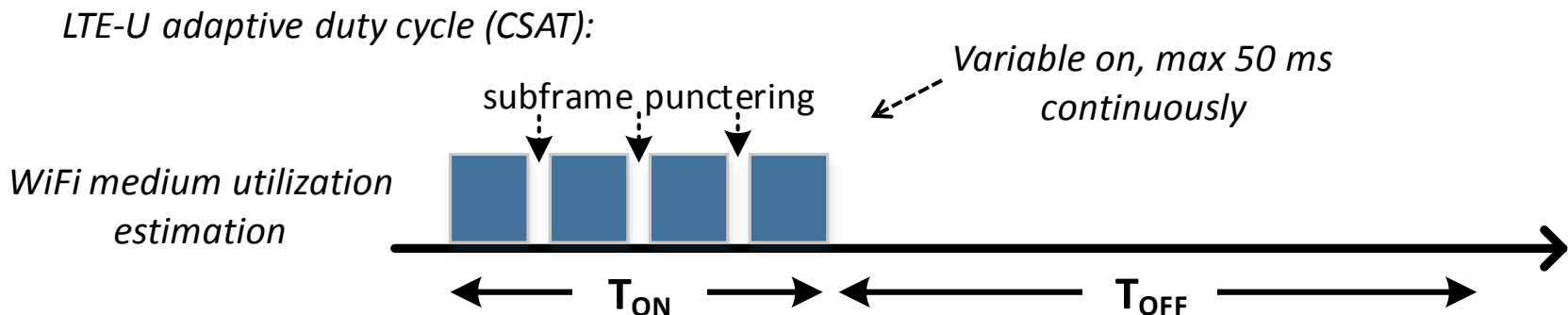


Source: Korea Communication Review, Jan. 2015

- LTE-Advanced uses **carrier aggregation** to offload data to unlicensed spectrum
  - LTE Primary Cell (PCell) in licensed spectrum for user + control data
  - LTE Secondary Cell (SCell) unlicensed spectrum (5 GHz UNII-1/UNII-3) for DL user data (control data remains in Pcell)
- **Problem:** LTE and WiFi compete for **shared radio resources**

# LTE Unlicensed Primer (II)

- Two approaches for LTE in unlicensed spectrum:
  - LTE-LAA (3GPP),
  - **LTE-U** (LTE-U Forum)
    - Rel-10/11/12 (FDD only),
    - scheduled, ON/OFF SCell access
    - **adaptive duty cycle** based on sensing of 802.11 frames / **Carrier Sense Adaptive Transmission (CSAT)**
    - only countries with non-LBT requirement



# Impact of LTE-U on WiFi

- The LTE-U DL signal may (or may not) impact WiFi communication in three ways:

**1** – **Blocking medium access** by triggering the Energy Detection (ED) physical Carrier Sense (CS) mechanism of WiFi

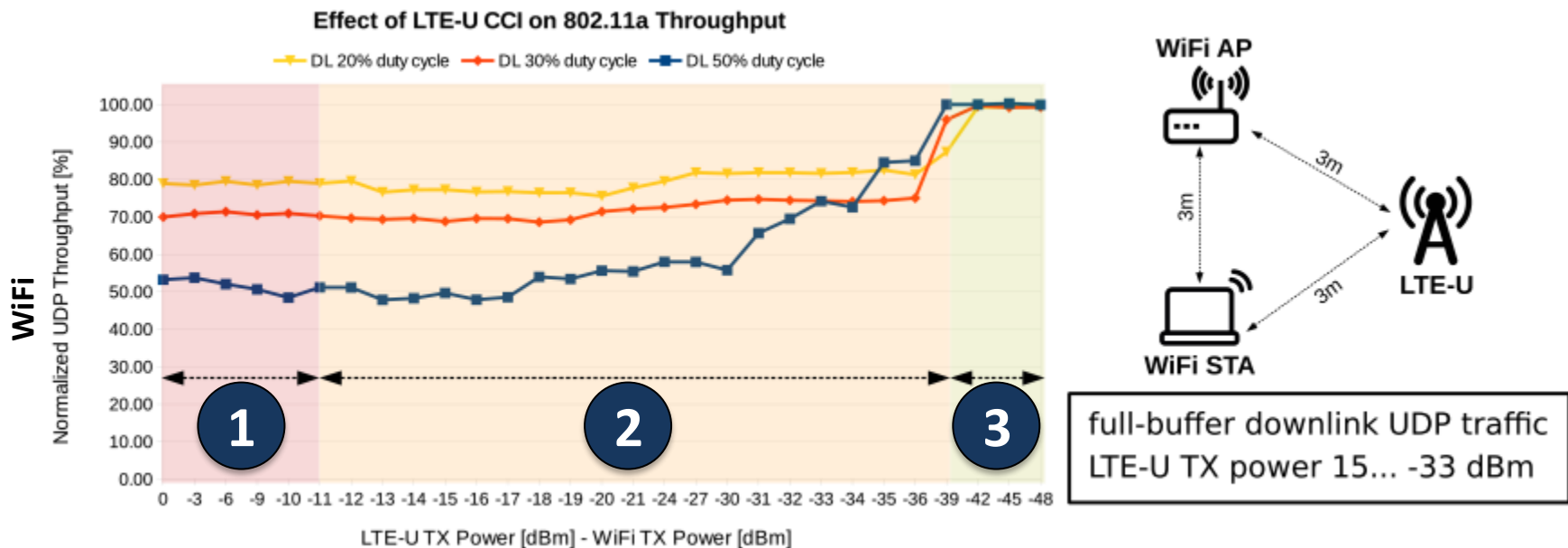
- Strong interference level ( $>-62$  dBm)

**2** – **Corrupting packets** due to co-channel interference from LTE-U.

- Medium interference level ( $<-62$  dBm)

**3** – **No impact** due to insignificant co-channel interference from LTE-U.

# Impact of LTE-U on WiFi (II)



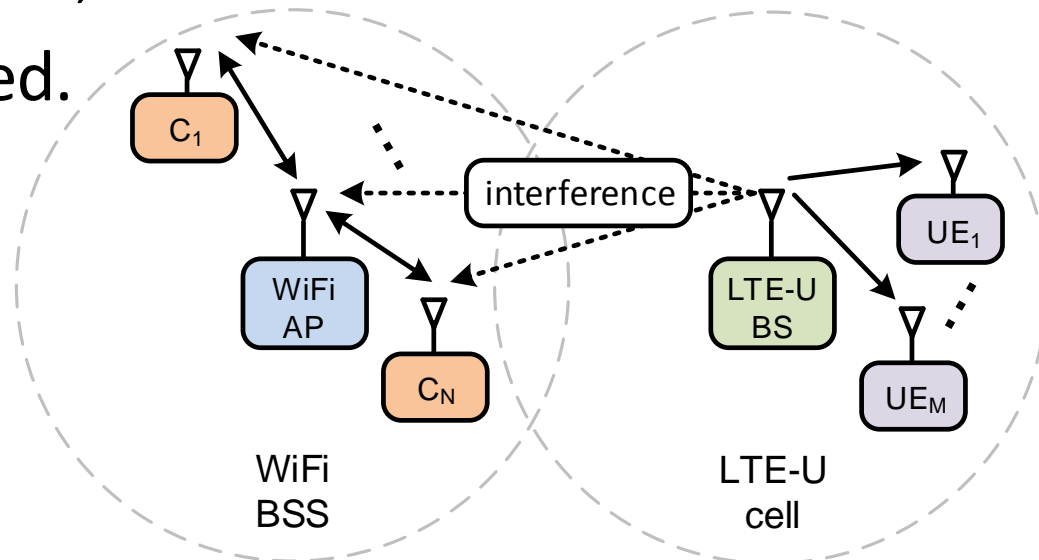
- Impact of LTE-U with different duty cycles on 802.11a throughput
  - Lots of literature on that topic [1]-[6] => here our **own results**,
  - WiFi throughput widely directly proportional to LTE-U duty cycle (UL+DL)

# Problem Statement

- To be able to cope with impact from LTE-U, an approach that **enables WiFi**
  - to **detect the LTE-U interference**,
  - to **quantify** the effective **available medium airtime** of each WiFi link (DL/UL) during runtime,
  - to obtain **timing information** about LTE-U ON and OFF phases,

is needed.

*System model:*





# Problem Statement (II)

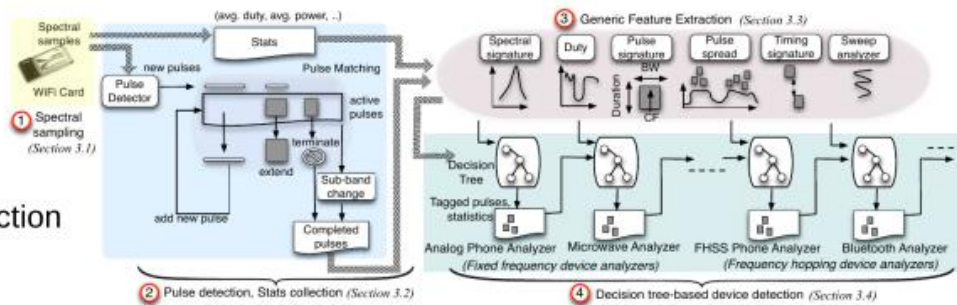
- Desired **detector properties**:
  - Online algorithm running on WiFi AP,
  - Passive and low-complexity,
  - Using commodity 802.11 hardware,
  - Covering the whole LTE-U interference range.



*Atheros AR95xx 802.11n chip*

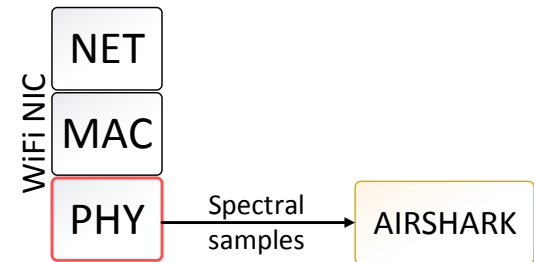
# WiPLUS Design (I)

- Known approaches for detection of non-WiFi interference are based on analysis of spectral samples (PHY), e.g. Airshark



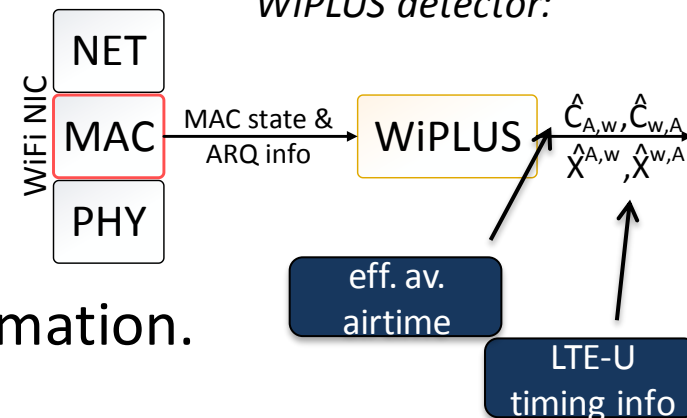
Airshark detection pipeline:

Interference detectors:



- WiPLUS is based on **MAC layer monitoring**
  - .11 MAC is a finite state machine (FSM) with different states,
  - .11 MAC ARQ tracks information about frame retransmissions,
  - WiPLUS monitors and samples MAC FSM state transitions and ARQ information.

WiPLUS detector:

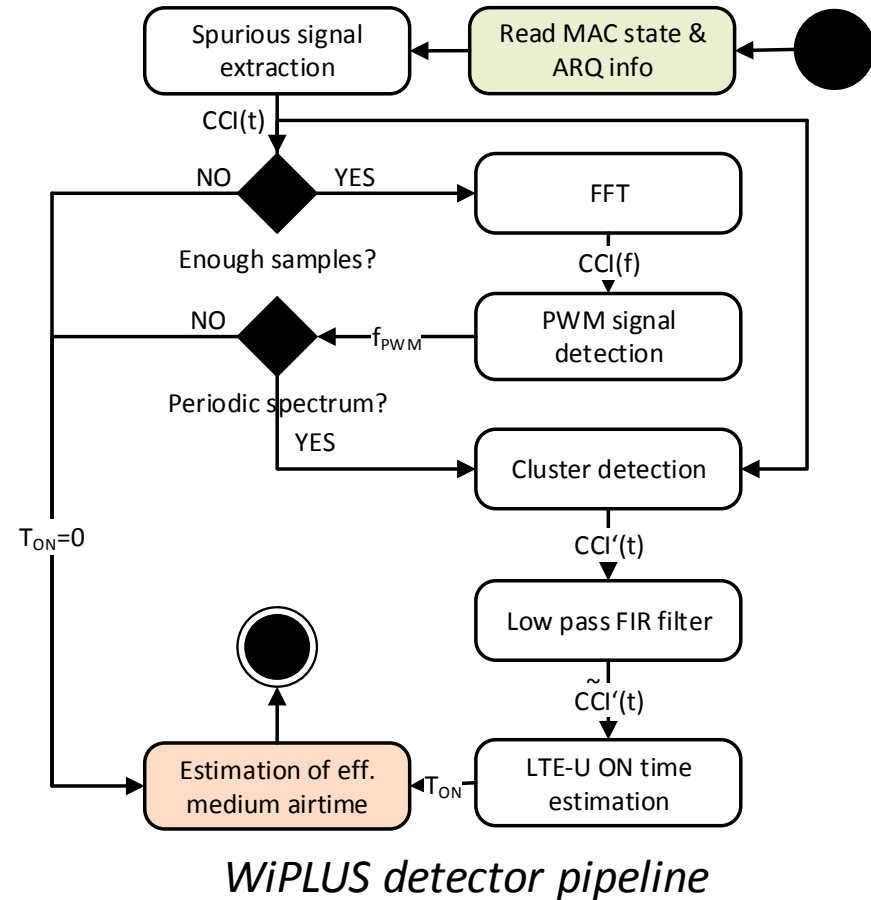


# WiPLUS MAC Layer Monitoring

- Basic idea:
  - As WiFi cannot decode LTE-U frames it has to rely on ED-based CS.
    - We observe the **MAC FSM state**, i.e. LTE-U's medium share equals the time share that corresponds to **energy detection without triggering packet reception** -> *interference regime 1*.
  - If LTE-U signal is weak (below ED CS), it can, without being detected by Wi-Fi's ED CS, corrupt ongoing WiFi transmissions.
    - We observe the **MAC ARQ state**, i.e. analyzing the number of MAC layer retransmissions to detect packet corruption (size of **packet loss burst** ~ LTE-U ON phase) -> *interference regime 2*.

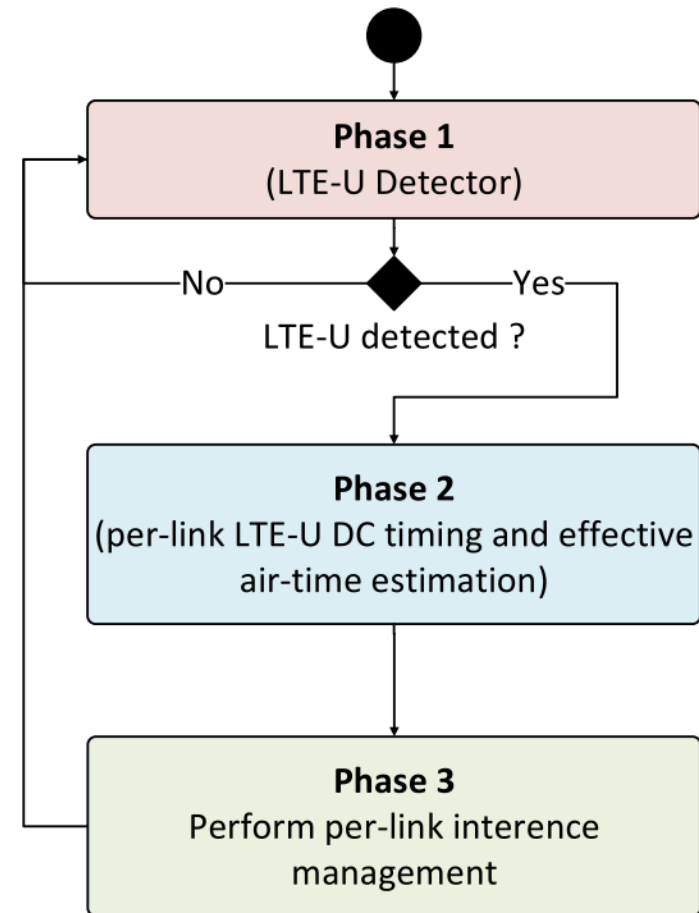
# WiPLUS Detector Pipeline

- Input data is **very noisy**,
- **Detector pipeline:**
  - Periodically sampled MAC FSM states (RX/TX/IDLE/ED state) + MAC ARQ states (missing ACK),
  - Spurious signal extraction (cleansing),
  - FFT / PWM signal detection,
  - Used to find fundamental frequency (harmonics) of interfering signal,
  - ML cluster detection (k-means):
    - Remove signals outside clusters to suppress outliers,
  - Low pass filtering,
  - LTE-U ON time estimation & calculation of eff. available airtime for WiFi.



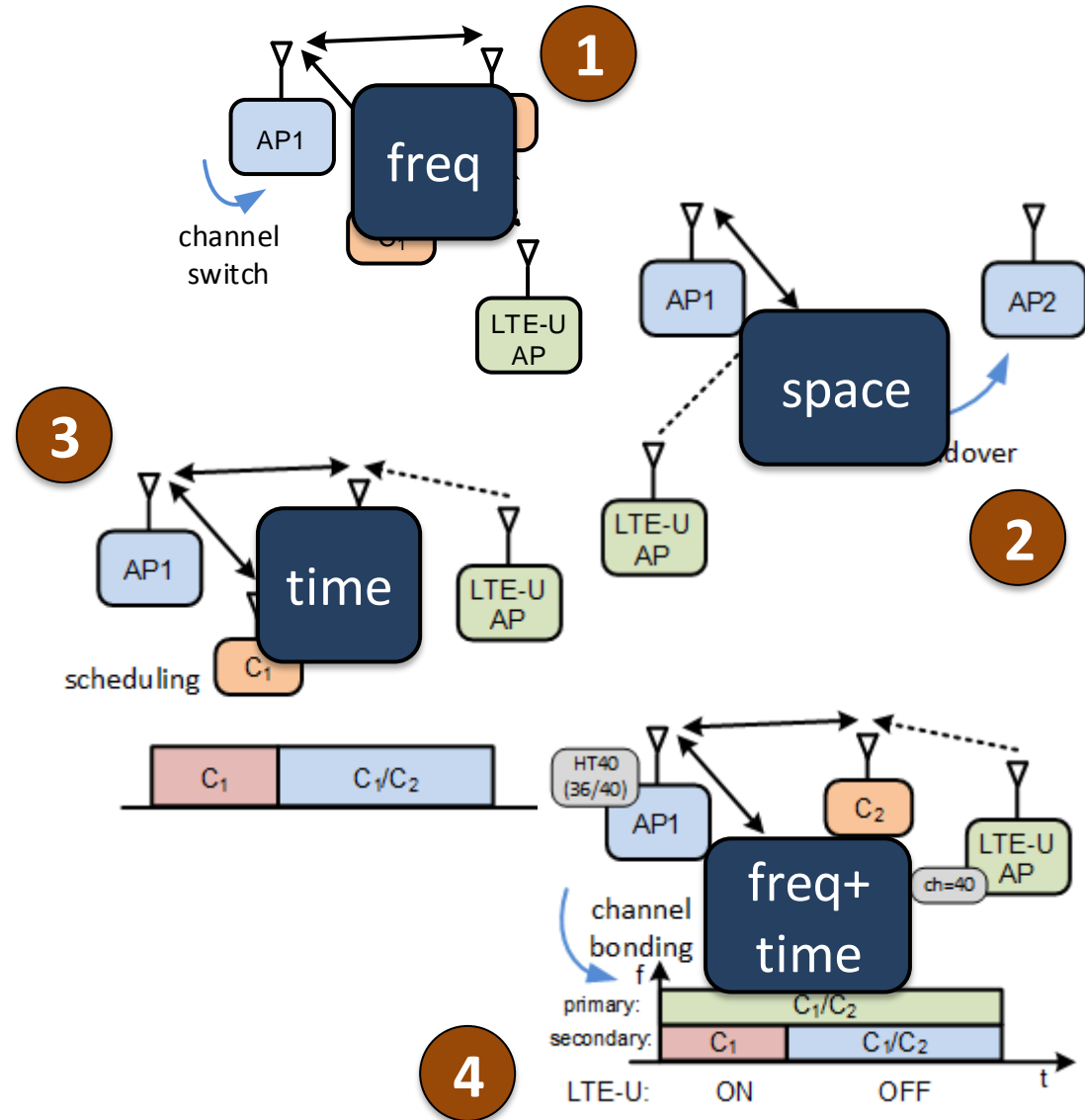
# WiPLUS Design (II)

- WiPLUS consists of *three phases*:
  - **Phase 1**: detector runs passively in background and terminates in case any interfering LTE-U signal is detected.
  - **Phase 2**: to discriminate the interference level on each WiFi DL link we switch into a time slotted access to test each link independently
    - effective available medium airtime & precise timing information of LTE-U ON/OFF phases are derived.
  - **Phase 3**: execution of various interference mitigation strategies.



# WiPLUS enabled Interference Mitigation Strategies

1. Interference-aware channel selection,
2. Interference-aware Load Balancing,
3. Interference-aware Medium Access,
4. Interference-aware Channel Bonding.



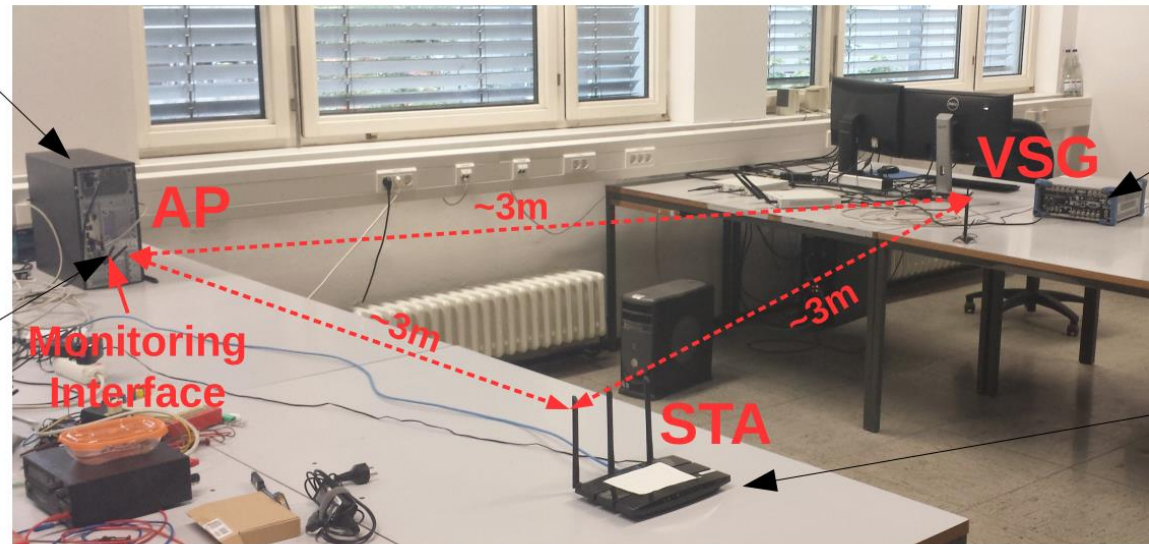
# WiPLUS Implementation

- WiPLUS was **prototypically** implemented & tested:
  - Raw MAC FSM/ARQ data sampling using modified RegMon [10] tool,
  - Regmon was designed for uniprocessor embedded systems (OpenWRT) → migration to SMP systems (Ubuntu 16.04 & upstream ath9k driver),
- WiPLUS online detector functionality implemented in Python using libraries
  - SciPy,
  - NumPy,
  - Sklearn,
  - Other: weightedstats, peakutils



machine learning in Python

# Experiment Setup & Methodology



Intel Core i5-6600K  
Compex WLE350N5-23  
Atheros AR9590  
Debian 8.5 x86\_64

Netgear WNDA3200  
Atheros AR9280

R&S SMBV100A  
w/ external 5 dBi antenna

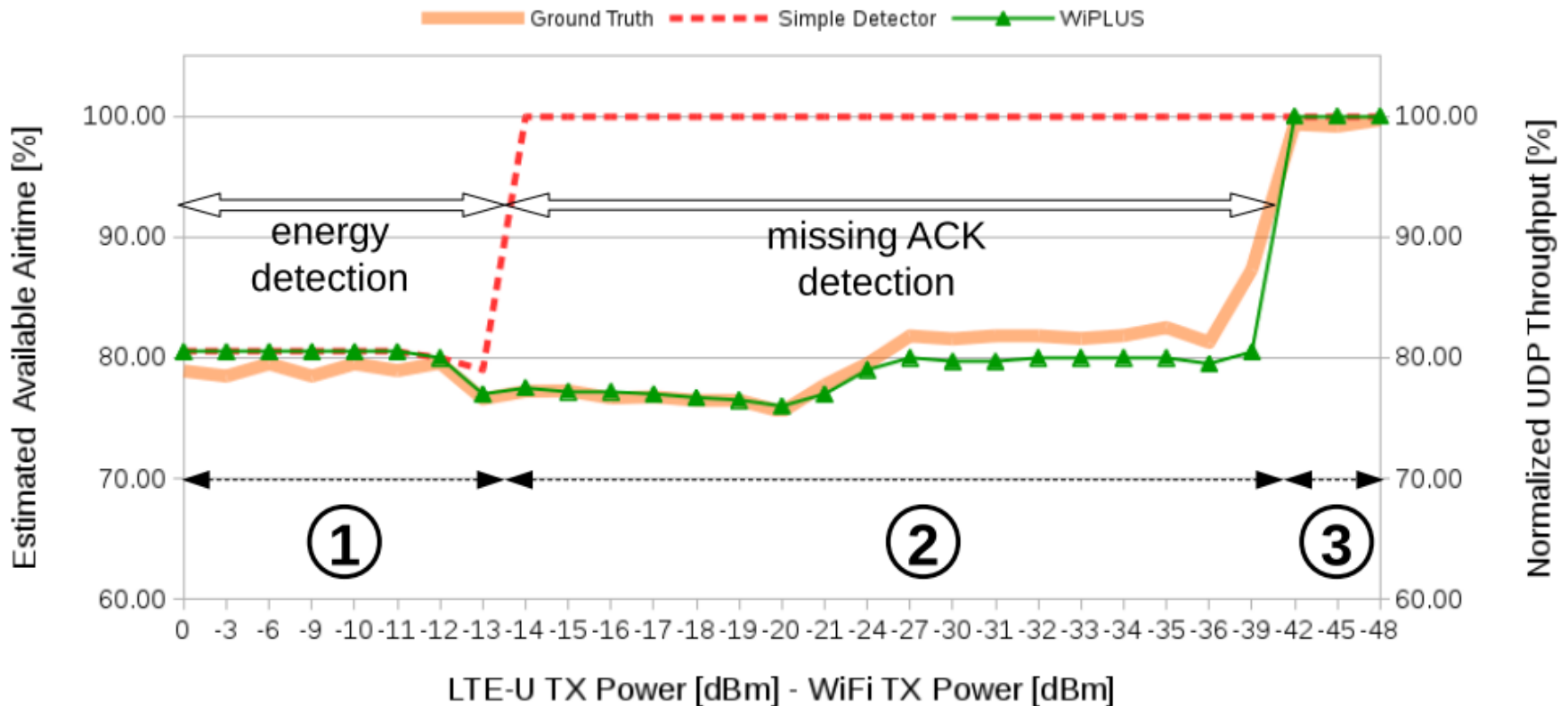
TPLink TL-WDR4300  
Atheros AR9344 + AR9580  
OpenWRT 15.05.1

- WiFi setup
  - 802.11a, channel 48 (5240 MHz), no encryption
  - AP+STA: powersave disabled, ANI disabled, SISO (1x1), 15 dBm fixed
  - Traffic: iperf3, full-buffer UDP, 1470 Bytes payload, 100% UL/DL
- LTE-U setup
  - R&S Vector Signal Generator (VSG) at  $f_c=5240$
  - LTE-U waveform generated with Matlab
  - Evaluation with different TX power levels: 15...-33 dBm



# Selected Experiment Results

- **Scenario:** 100% full-buffer DL traffic WiFi, LTE-u w/ 20% duty cycle
- **Simple Detector**
  - energy detection only
  - ~15 dB detection range
  - covers interference regime 1 only
- **WiPLUS**
  - combined energy+missing ACK detection
  - ~45 dB detection range (+30 dB)
  - covers all interference regimes
  - slight overestimation in low IF regime



# Conclusion

- Design and implementation of **WiPLUS**, a **passive LTE-U interference detector**, which runs on WiFi APs only and is only using **COTS WiFi hardware**, was presented and experimentally evaluated.
- **WiPLUS** works passively & in real-time.
- Experiment results showed very good LTE-U **detection accuracy** over a complete range of interferer signal strengths.
- WiPLUS enables novel **interference mitigation strategies**

# References

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