

# Demystifying the Role of AI in Your Cisco Wireless Deployments

**cisco** Live !

Vishal Desai  
Principal Engineer, Cisco Wireless



**The machine does not isolate man from the  
great problems of nature but plunges him  
more deeply into them**

**- Antoine de Saint-Exupéry**

*Source: Wind, Sand and Stars (Chapter III)*

# Vishal Desai

Principal Engineer



New Speaker



## Expertise

AI-Driven Wireless Solutions, Wi-Fi PHY Optimizations, Distributed Systems, Resource Management



## Experience

19+ years experience in the Wi-Fi industry. Holds 219 patents in the areas of wireless communications and distributed systems



## Education

BS/M.Eng in Computer Science from Cornell University



## Hobbies

Hiking, scouting and backyard gardening with my son.

# Agenda

- 1 Understanding AI Landscape
- 2 AIOps in Cisco Wireless
- 3 System Architecture
- 4 Real-World Examples



Financial Services



Intelligent RF Management



Retail



Proactive Assurance



Education



AI-Driven Config Guidance

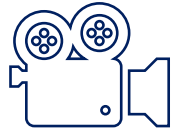
- 5 Key Takeaways

# Understanding AI Landscape

# Omnipresent AI: Silently Shaping Life Before the Hype



Spam Filters



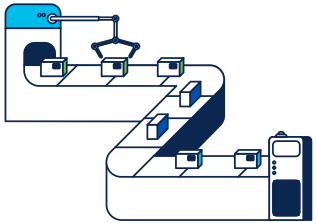
Movie  
Recommendations



Shopping



Face  
Recognition



Factory Automation



Biometrics



Diagnose  
Illness



Maps -  
Direction



Text to Speech

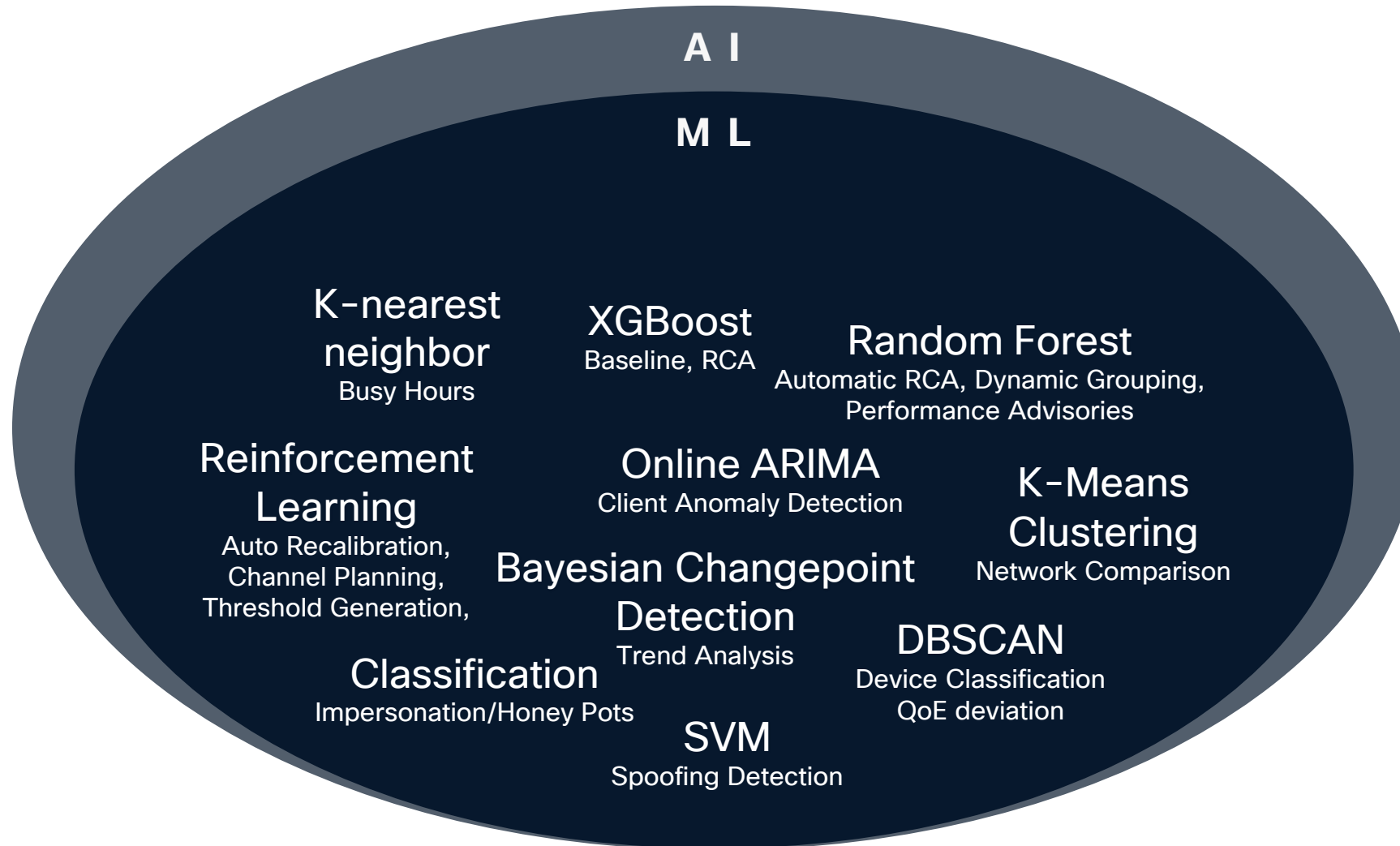
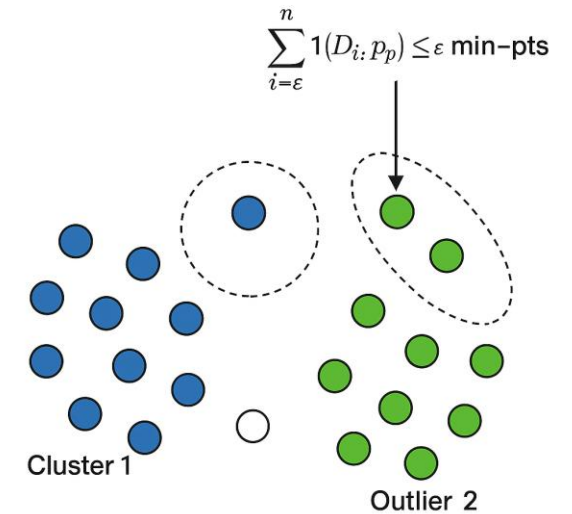
# Understanding AI Landscape



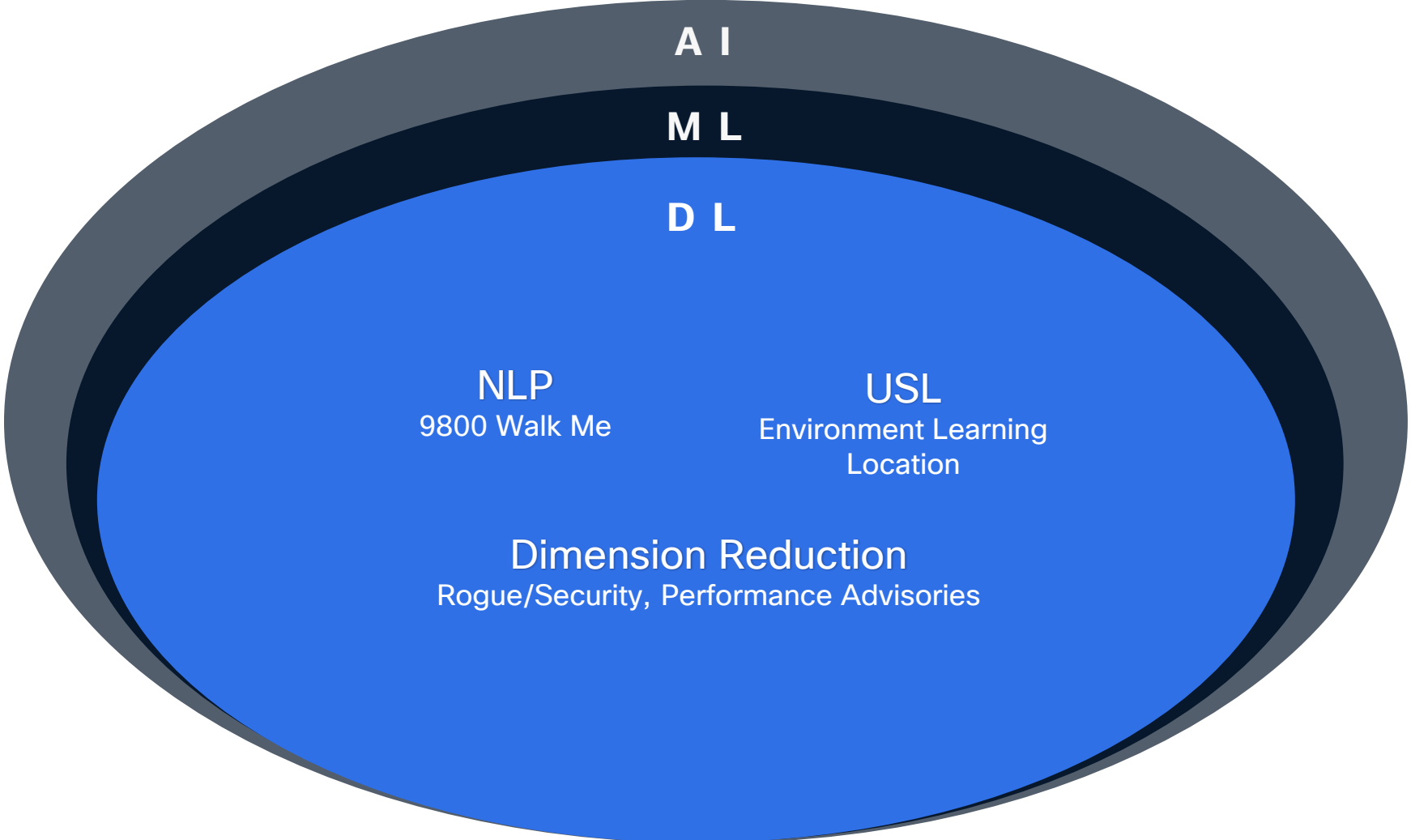
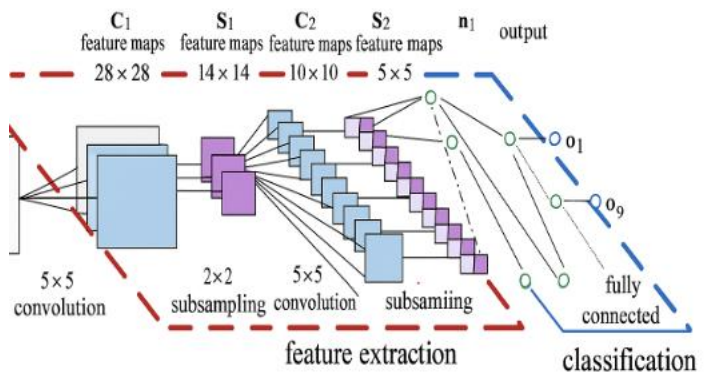
A I

Outcome oriented AI models to build customized solutions

# Understanding AI Landscape

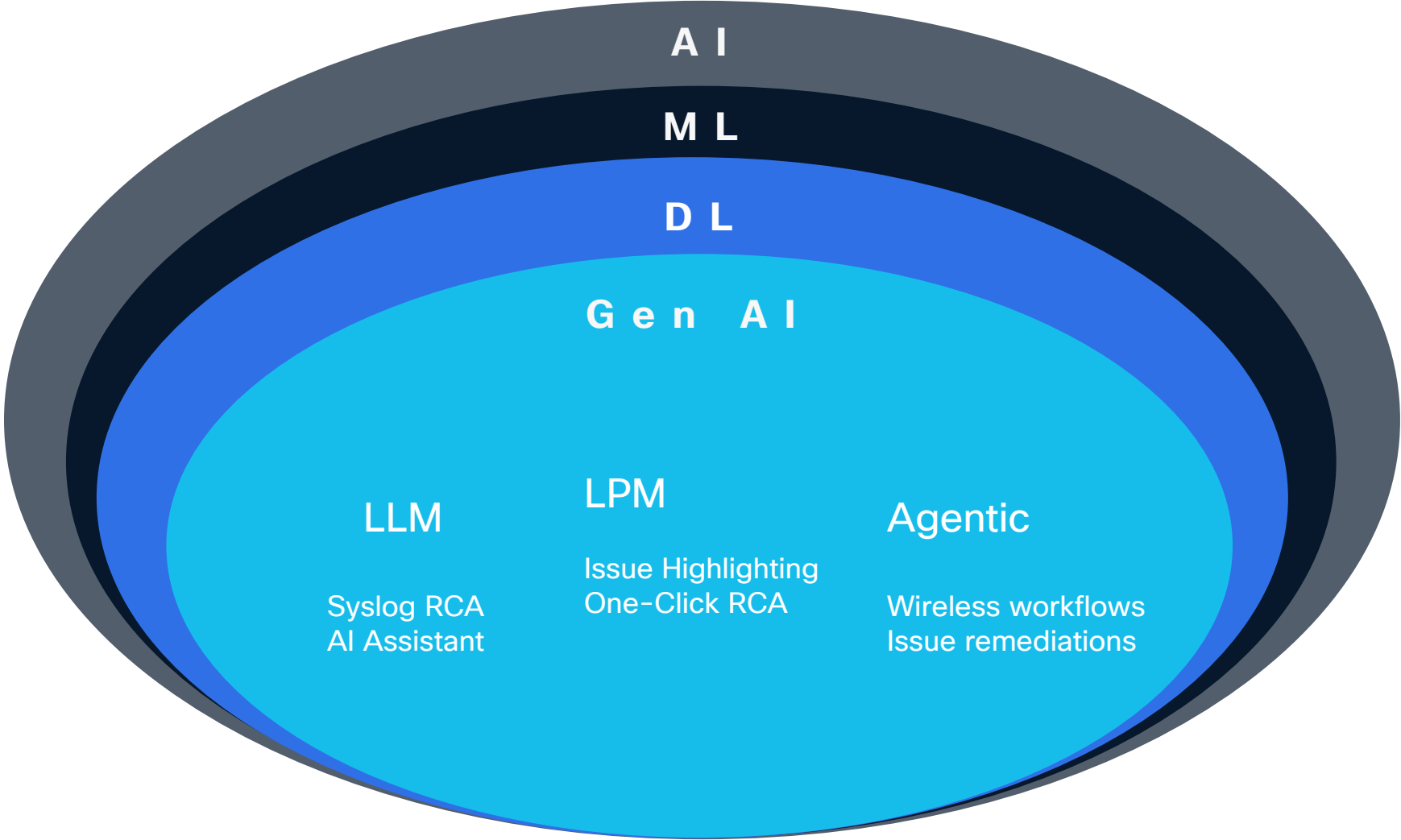
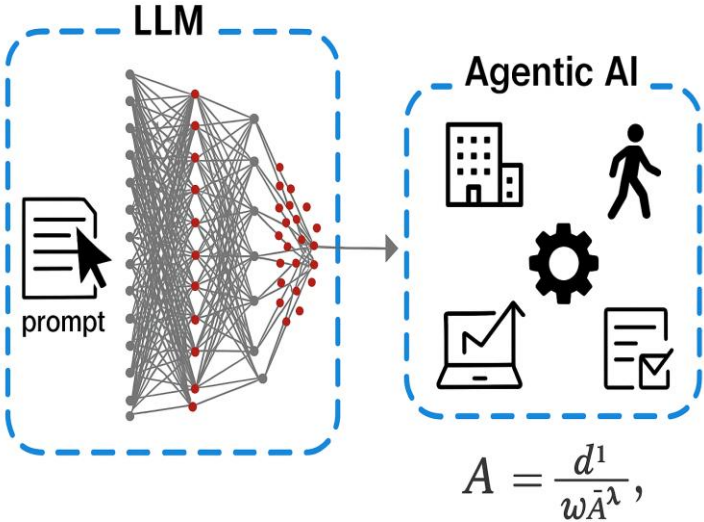


# Understanding AI Landscape



$$p_i = \sum_{l=b}^{a_i} x_l \frac{\exp a_i^{p_i}}{\sum \exp a_k}$$

# Understanding AI Landscape



# AIOps in Cisco Wireless

# Wireless Engineering Strategy on Applied AI



Focus on Problem Definition



Evaluate AI Suitability



Customized AI Solutions



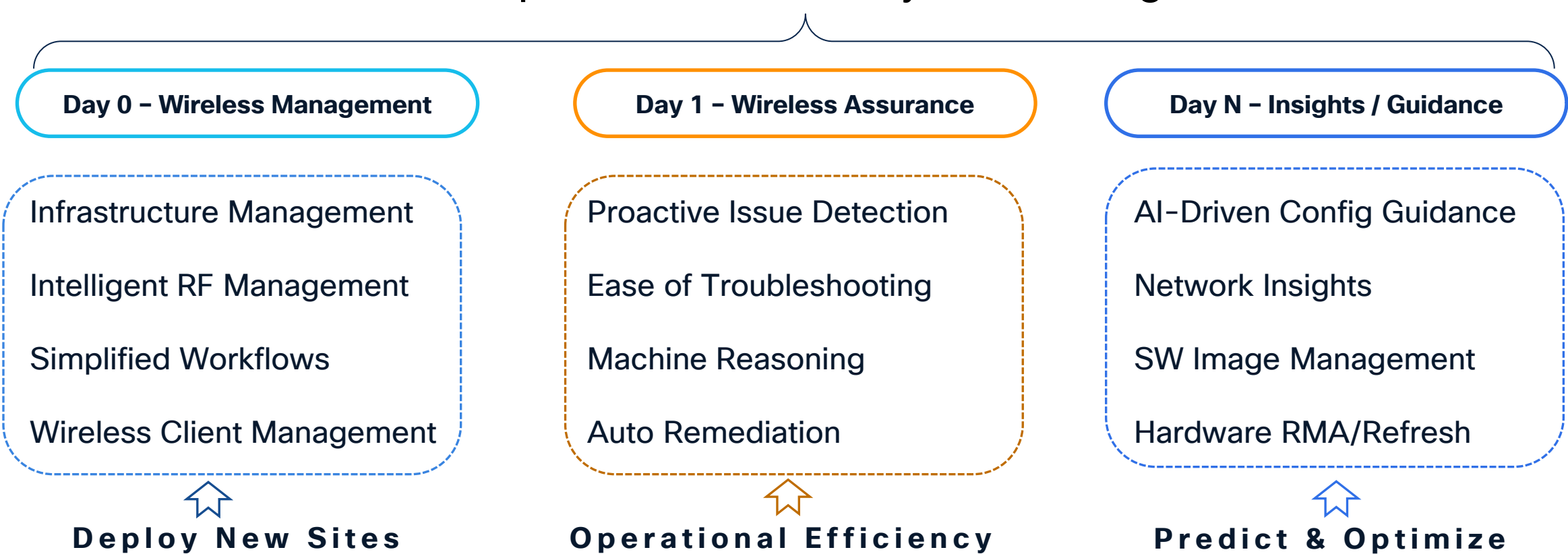
Integration with Existing Systems



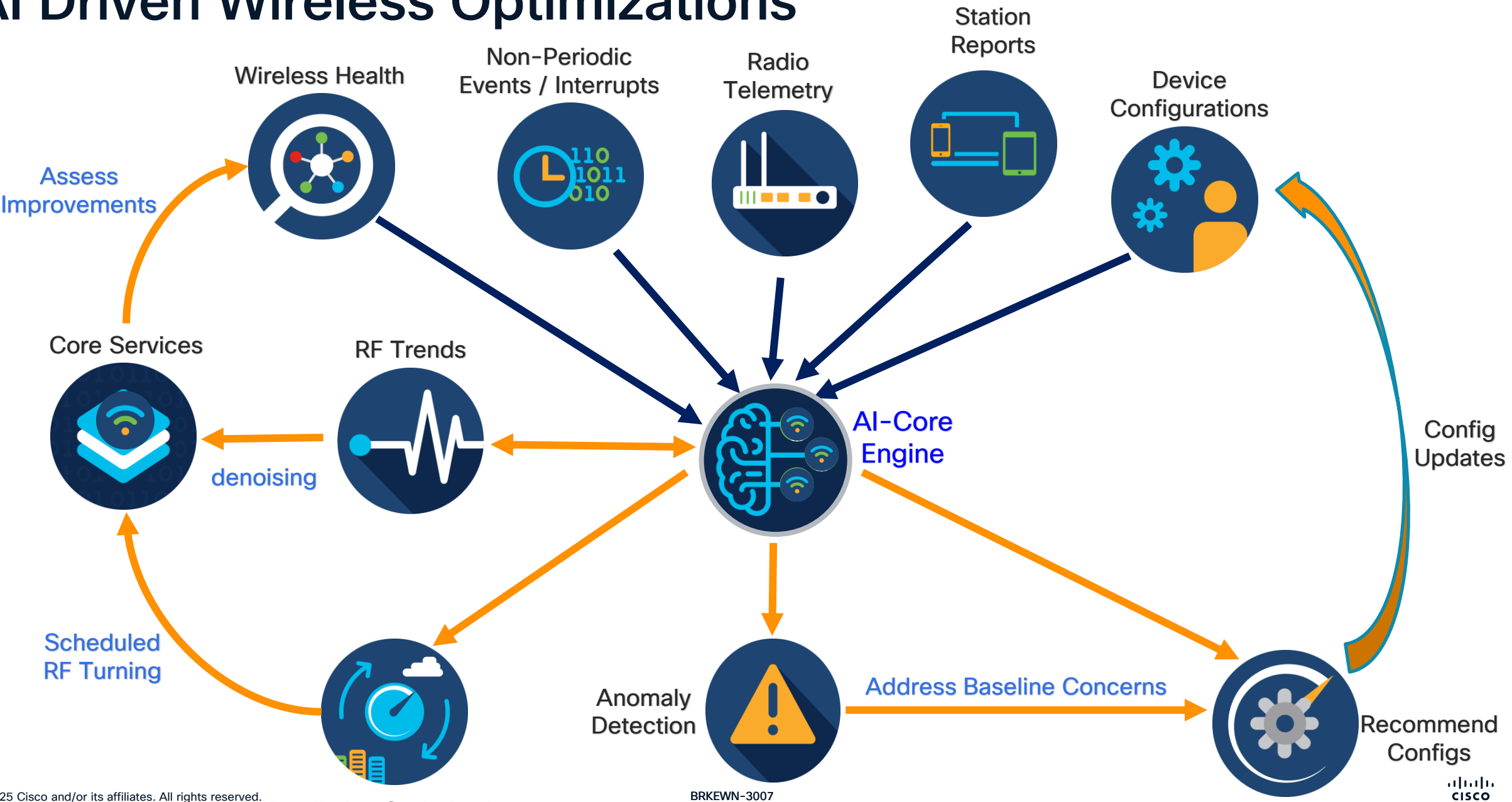
Iterative Approach

# AIOps for Network Lifecycle

## AIOps – Wireless Lifecycle Coverage

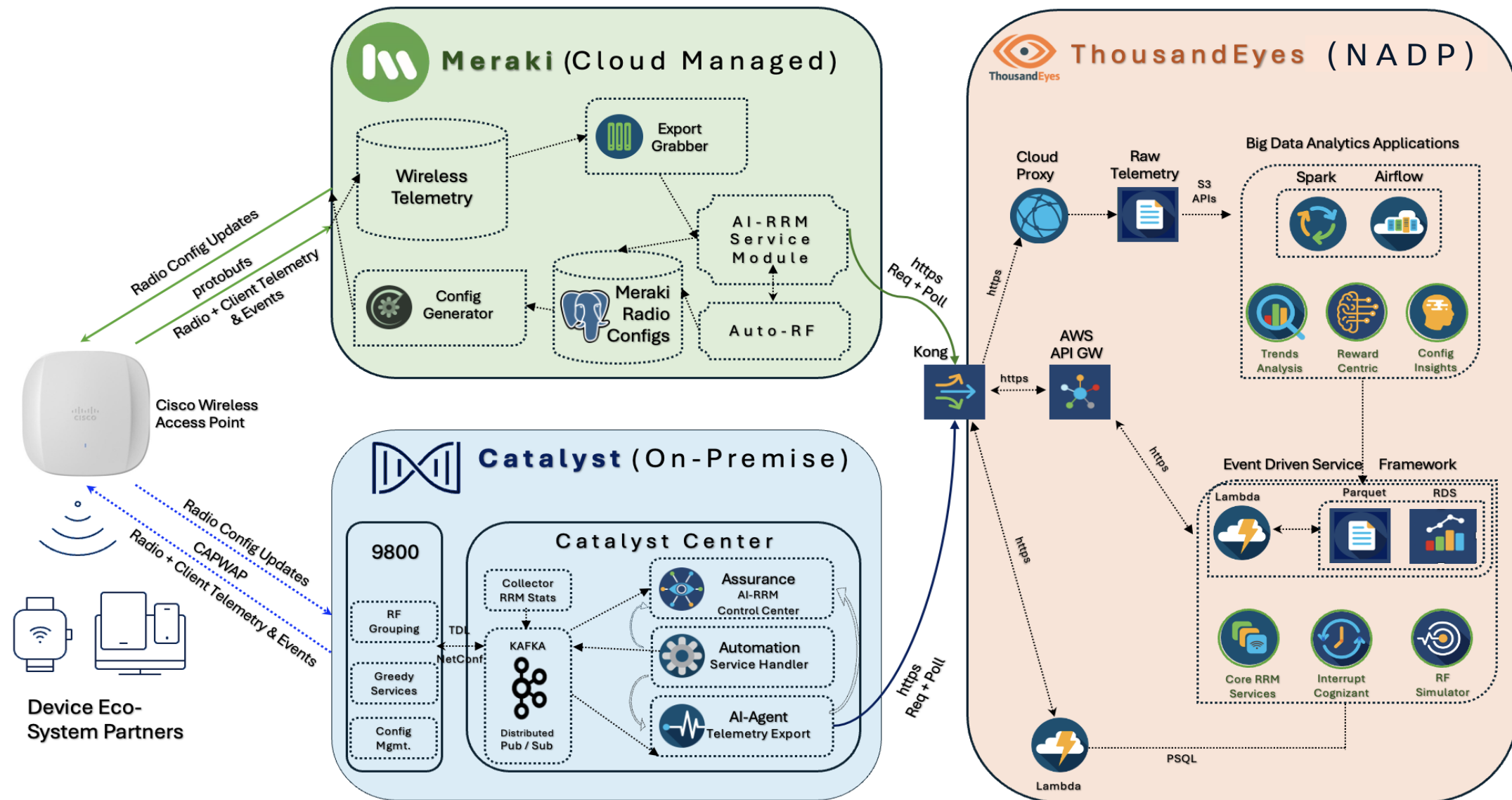


# AI Driven Wireless Optimizations



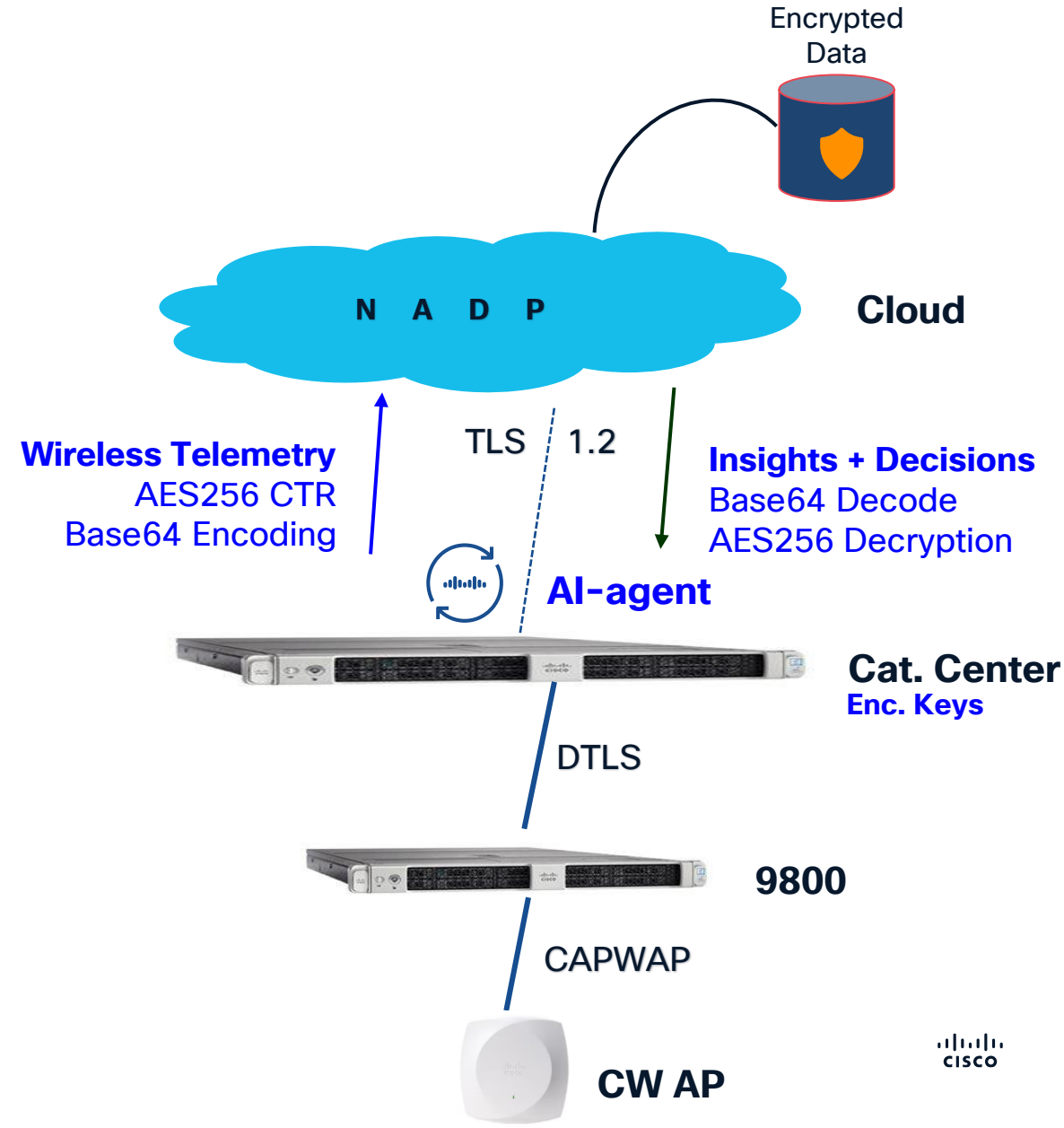
# System Architecture

# Applied AI Systems Architecture



# On-Prem Anonymization & Secure Data Handling

- **Secure tunnel:** between CW AP and the NADP Cloud
- **On-prem security:** Data is encrypted (AES-256) and Base64 encoded locally before cloud transfer.
- **End-to-end encryption:** Keys are stored on Catalyst Center; cloud data remains encrypted via AWS-native controls.
- **Real-time rendering:** Decryption occurs on-prem at runtime for secure UI display.



# Real-World Examples

# AI Focus Areas for Cisco Wireless

## Day 0 – Wireless Management

Infrastructure Management

Intelligent RF Management

Simplified Workflows

Wireless Client Management

## Day 1 – Wireless Assurance

Proactive Issue Detection

Ease of Troubleshooting

Machine Reasoning

Auto Remediation

## Day N – Insights / Guidance

AI-Driven Config Guidance

Network Insights

SW Image Management

Hardware RMA/Refresh



|                   |                             |
|-------------------|-----------------------------|
| Business Vertical | <b>Financial Services</b>   |
| Site Location     | <b>Europe</b>               |
| Managed Sites     | <b>46 Buildings</b>         |
| AP Count          | <b>652</b>                  |
| Wireless Clients  | <b>Avg ~5500, Peak 7862</b> |

# Problem Statement

- Areas of Concern



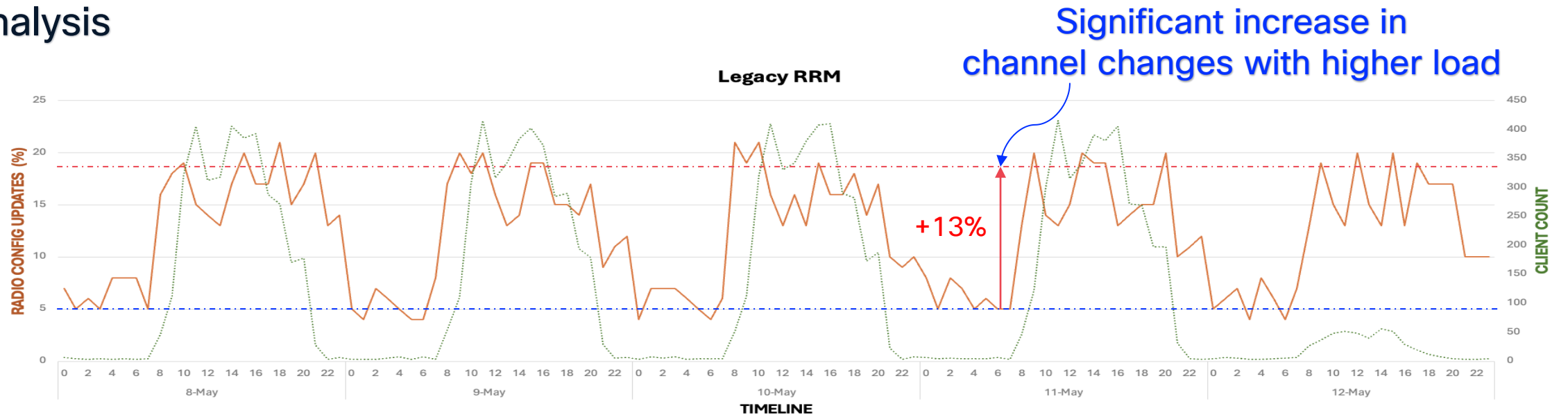
**Primary:** Frequent disconnects of the wireless clients

- Predominantly observed on the larger sites



**Secondary:** Slow Wi-Fi performance on certain buildings

- Analysis



# Classic Dilemma of RF Management Systems



# How is it achieved today?

## On-Premise (9800)

Configuration > Radio Configurations > RRM

6 GHz Band

5 GHz Band

2.4 GHz Band

FRA

General

Coverage

DCA

TPC

RF Grouping

Spatial Reuse

Dynamic Channel Assignment Algorithm

Channel Assignment Mode

Automatic

Off

Interval

8 hours

Anchortime

4

Channel Assignment Leader

CA-C9800 (10.10.105.240)

Last Auto Channel Assignment

410 second(s) ago

DCA Channel Sensitivity

medium

Optimize  
Wi-Fi every  
8 hours at 4 am  
12 noon & 8 pm

## Cloud-Managed (MR Dashboard)

5 GHz radio settings

Turn off 5 GHz radio

See band selection above.

Channel width

Auto

Manual

Doesn't offer customizations

20 MHz (28 channels)

Recommended for High Density deployments and environments expected to encounter DFS events. More unique channels available, reducing chance of interference.

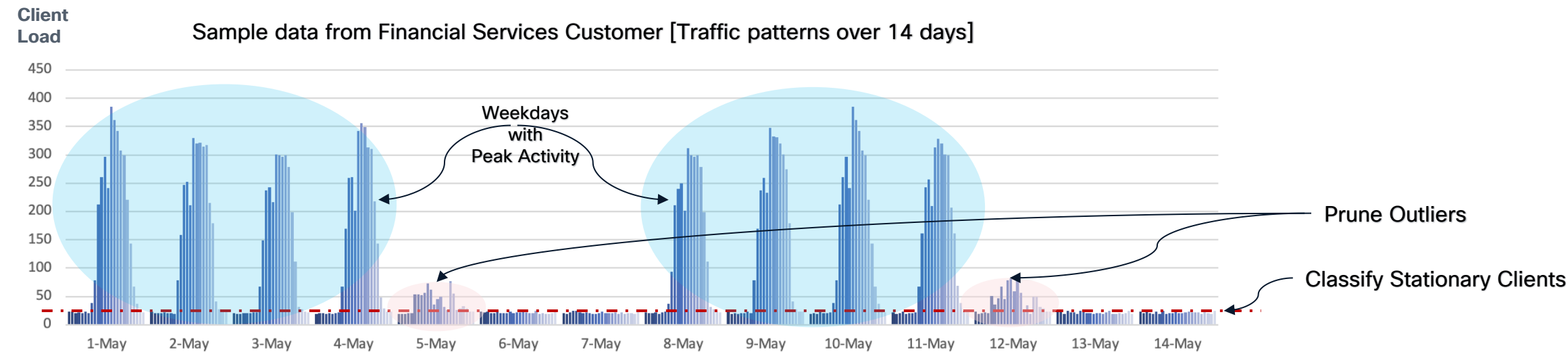
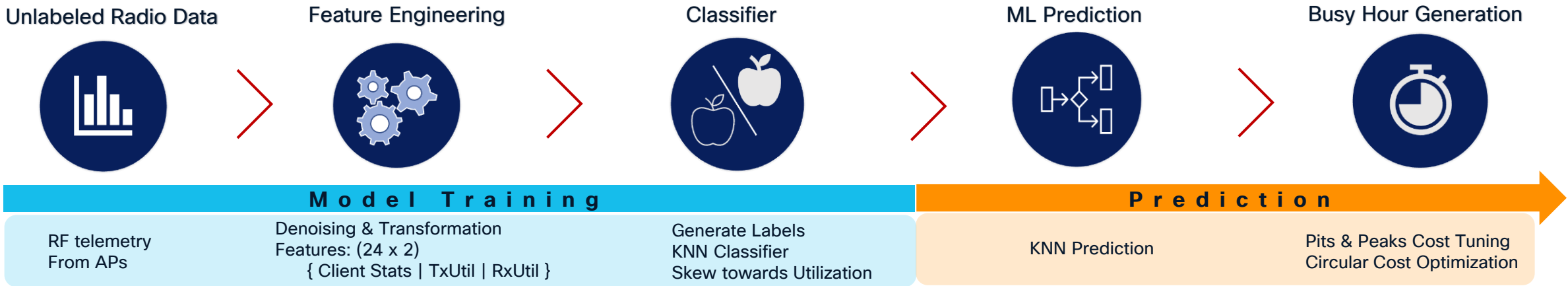
40 MHz (14 channels)

For low to medium density deployments.

80 MHz (7 channels)

For low density areas with few or zero neighboring networks. Higher bandwidth and data rates for modern devices. Increases risk of interference problems.

# Introducing AI Generated Busy Hours



# K-Nearest Neighbor (KNN)

$$k = \left\lfloor x + \frac{\alpha}{x} - 2\beta \right\rfloor$$

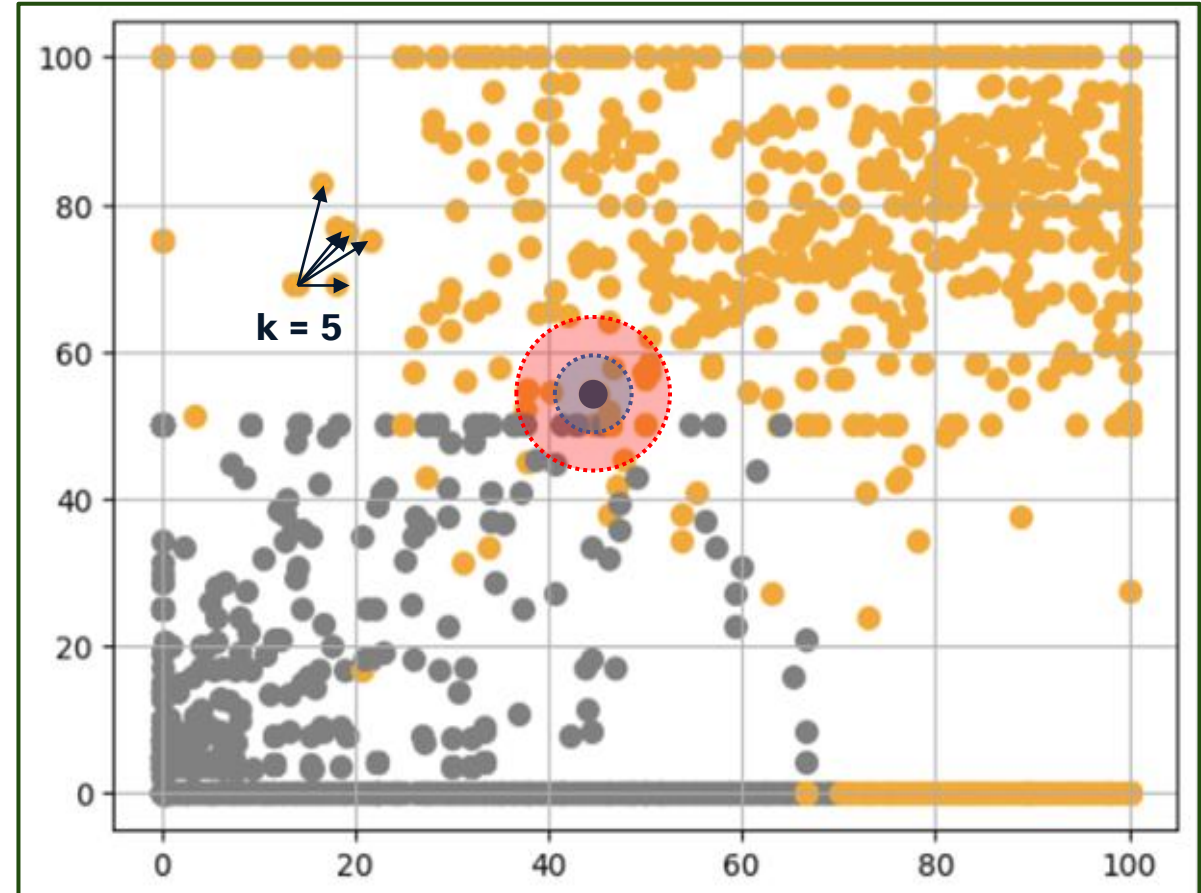
$x$  = non-stationary count

$\alpha$  = Wi-Fi utilization

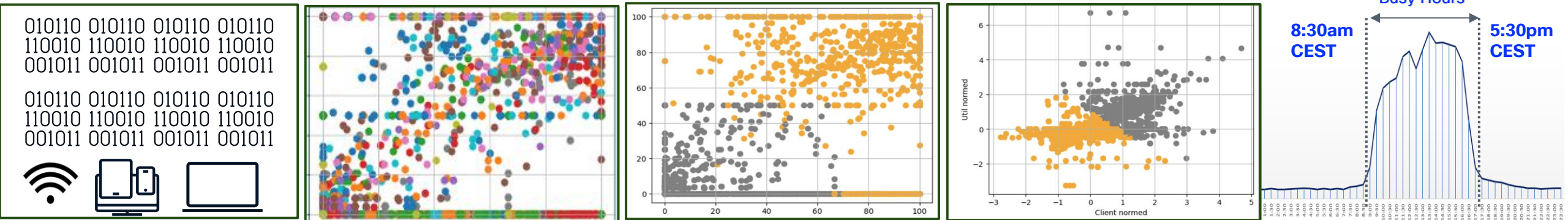
$\beta$  = inverse of session time



- Machine Learning algorithm for classification and regression
- Classification using data points' relation to their nearest neighbors
- Crucial to carefully evaluate optimal value of K
- Higher K reduces noise but can obscure patterns
- Busy Hours k value biased towards station, utilization and session length



# AI Generated Busy Hours



Consider changing busy hours on your building XYZ from 8:30am to 5:30pm

Unlabeled Radio Data



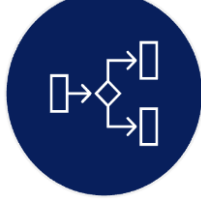
Feature Engineering



Classifier



ML Prediction



Busy Hour Generation



**Model Training**

RF telemetry  
From APs

Denoising & Transformation  
Features: (24 x 2)  
{ Client Stats | TxUtil | RxUtil }

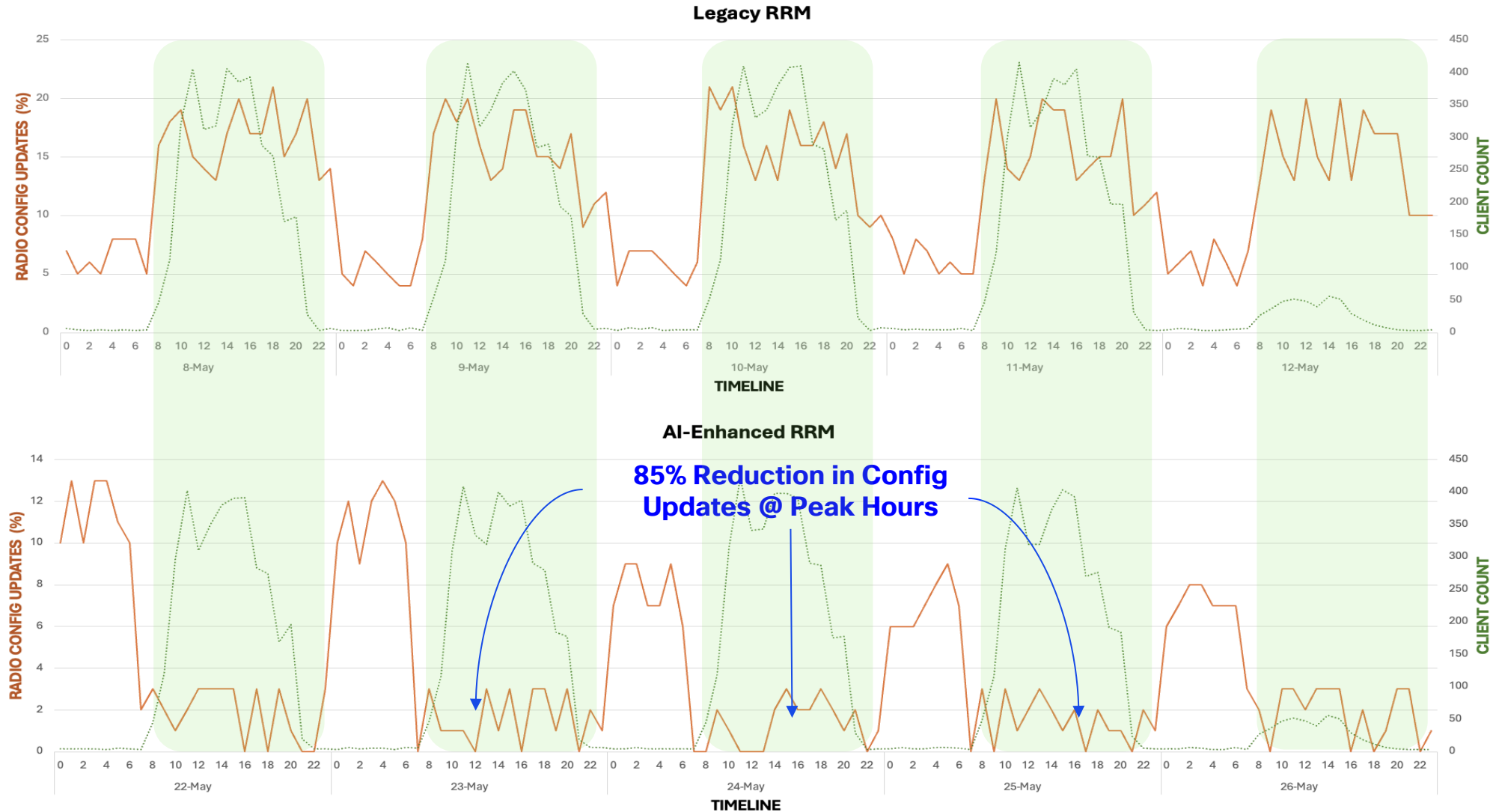
Generate Labels  
KNN Classifier  
Skew towards Utilization

**Prediction**

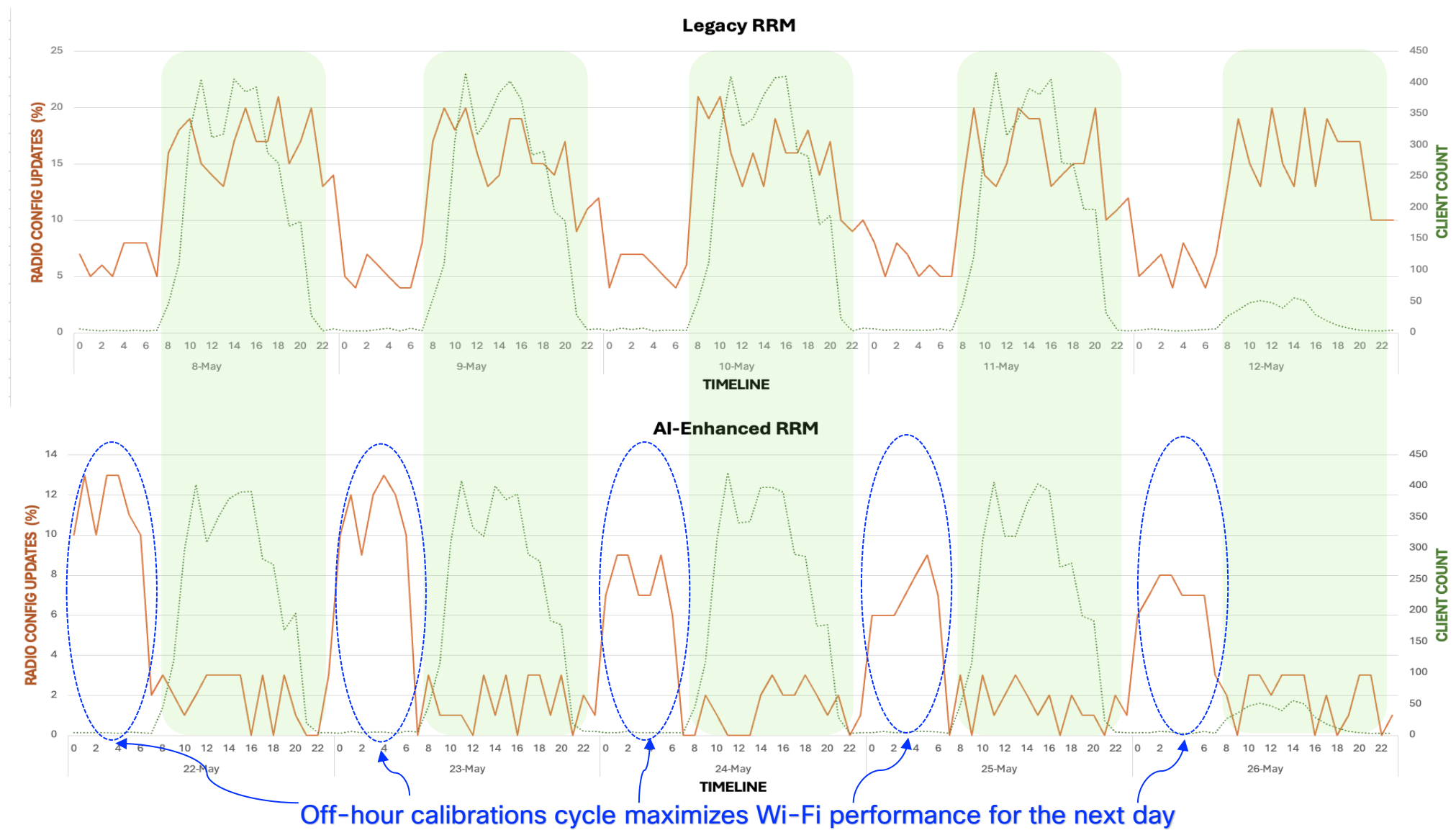
KNN Prediction

Pits & Peaks Cost Tuning  
Circular Cost Optimization

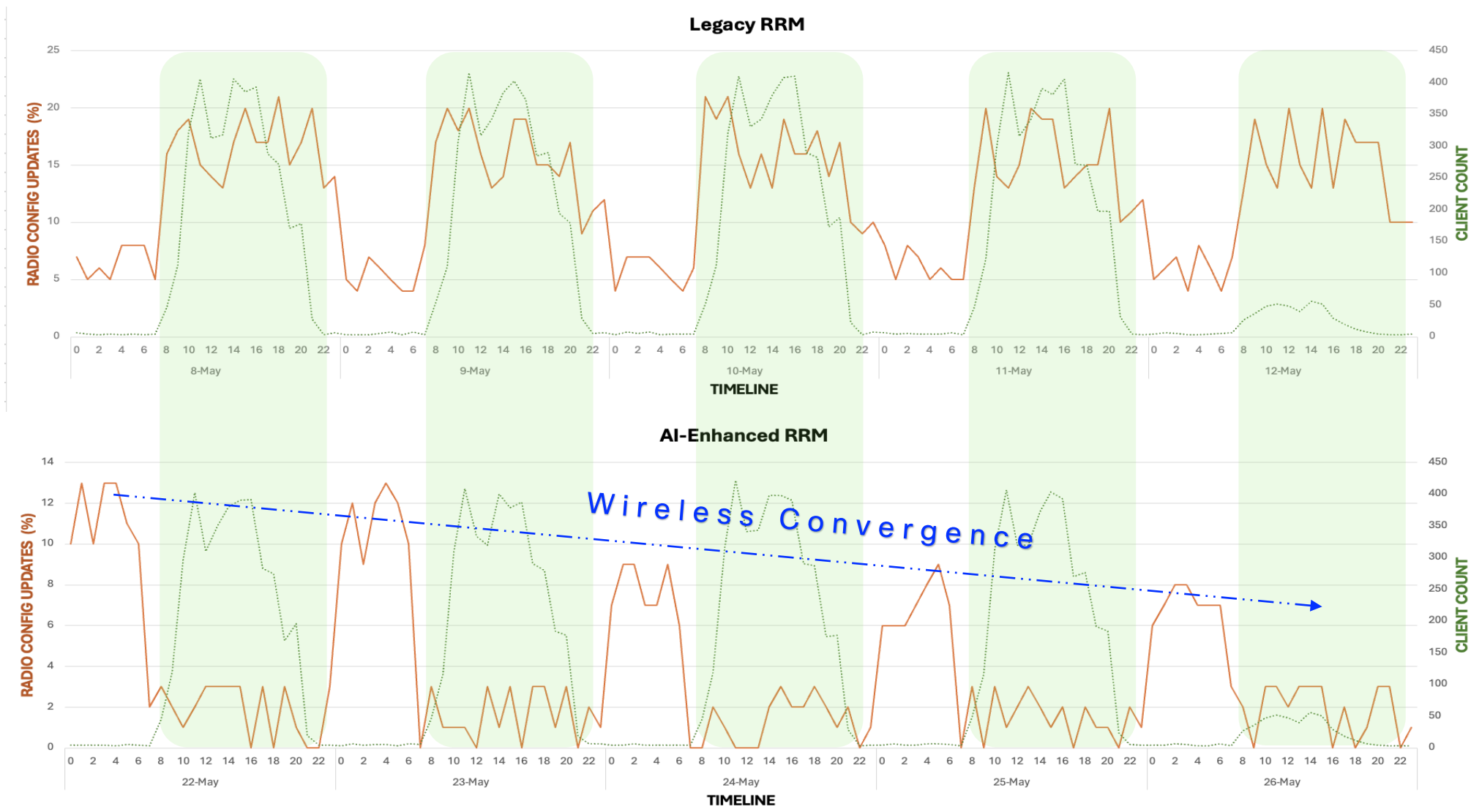
# Busy hour optimized trend-based AI-RRM



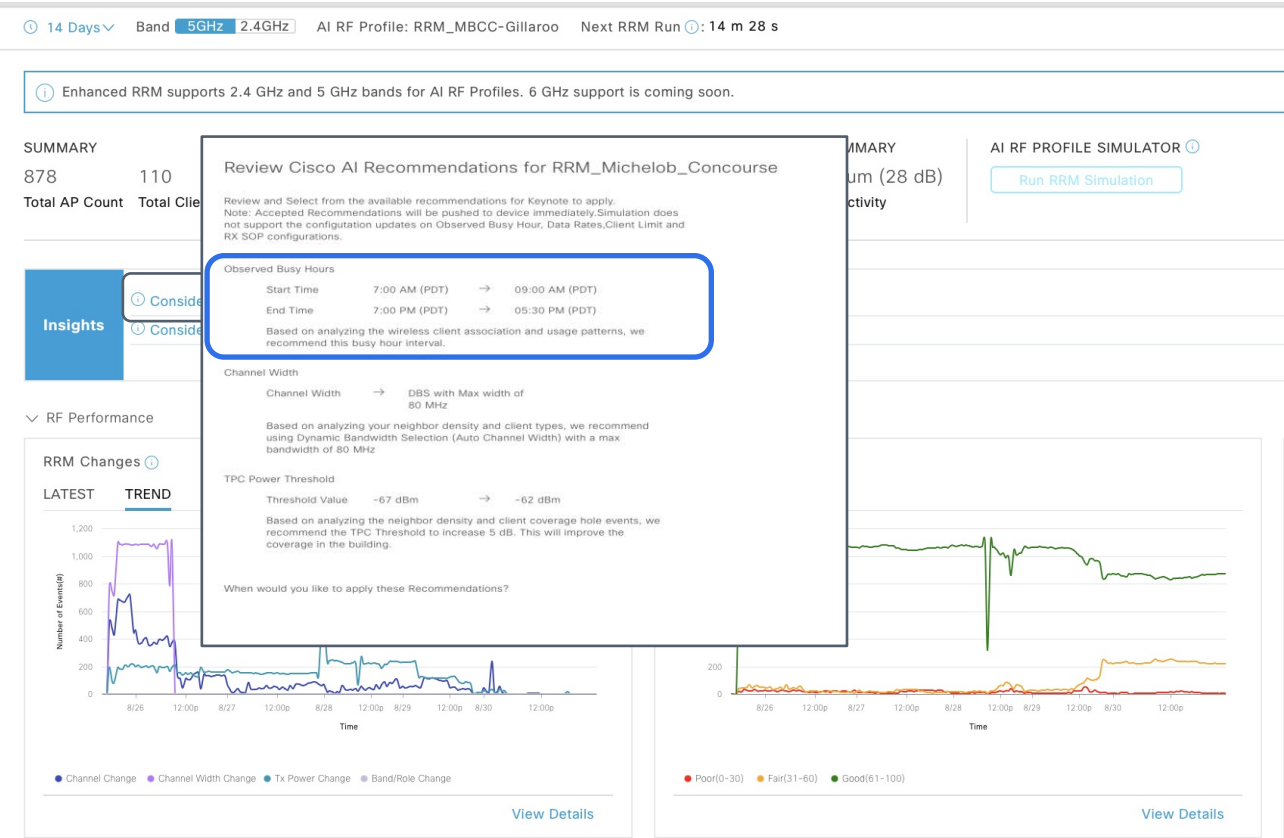
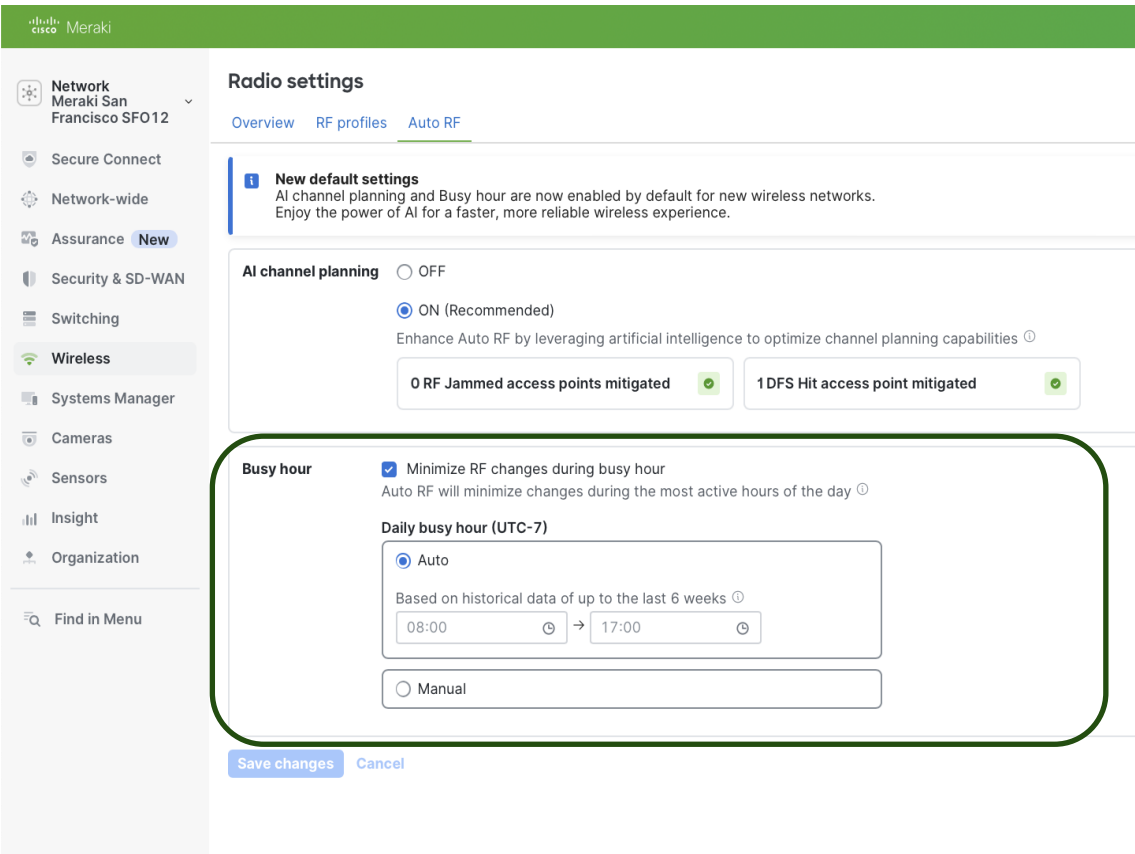
# Busy hour optimized trend-based AI-RRM



# Busy hour optimized trend-based AI-RRM



# Optimize YOUR network with AI-Driven Busy Hours



# AI Focus Areas for Cisco Wireless

## Day 0 – Wireless Management

Infrastructure Management

Intelligent RF Management

Simplified Workflows

Wireless Client Management

## Day 1 – Wireless Assurance

Proactive Issue Detection

Ease of Troubleshooting

Machine Reasoning

Auto Remediation

## Day N – Insights / Guidance

AI-Driven Config Guidance

Network Insights

SW Image Management

Hardware RMA/Refresh



Business Vertical **Retail**

Site Location **North America**

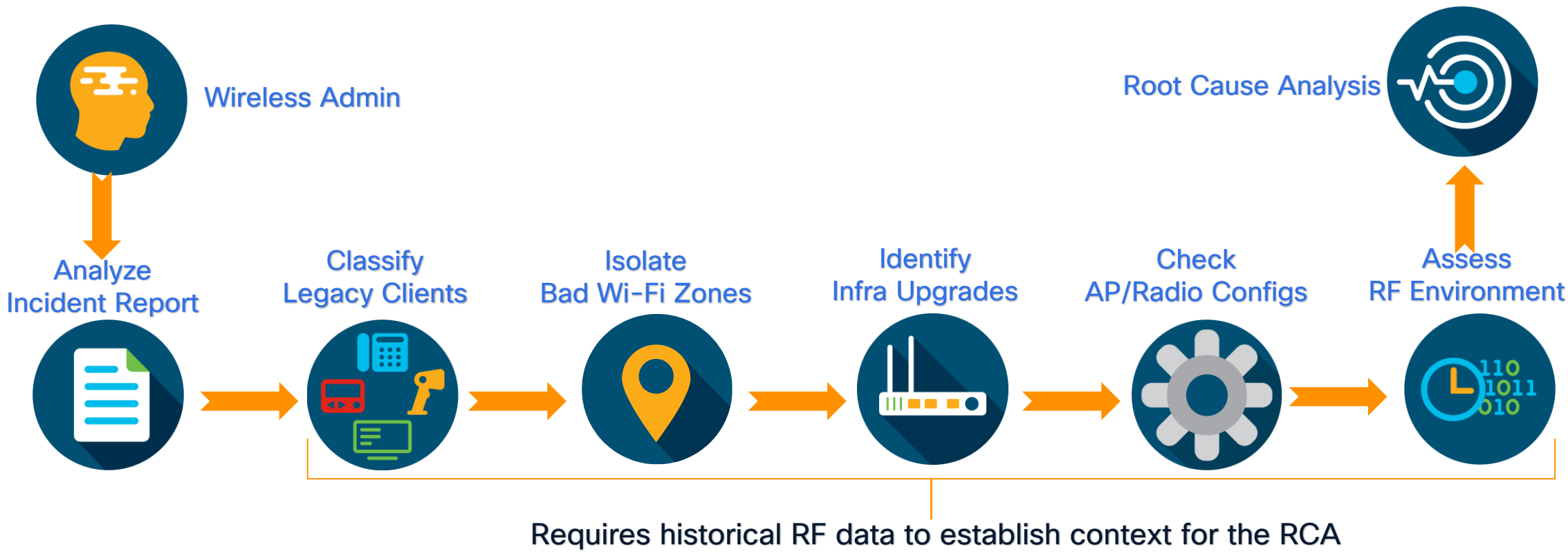
Managed Sites **14**

AP Count **217**

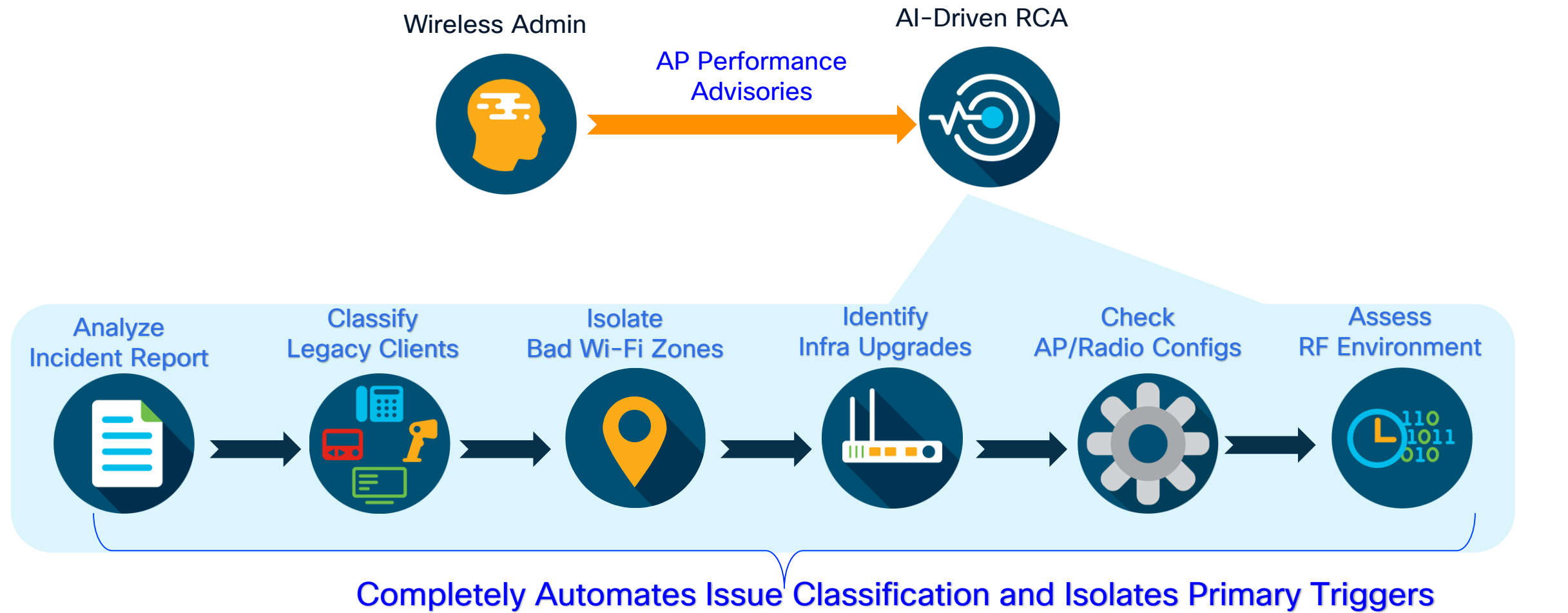
Wireless Clients **Avg ~1700, Peak 2852**

# Traditional Analysis Approach

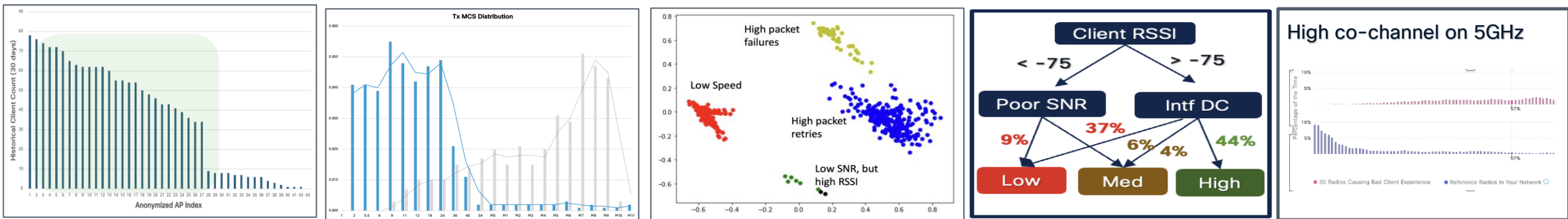
Primary Concern



# AI-Driven Advisories Simplifies Wireless Troubleshooting



# AI-Driven Proactive Advisories Method



Identify Top APs

Feature Engineering

QoE Clustering

Root Cause Analysis

Insights Generation



**Model Training**

**Inferencing**

Identify crucial radios by historical clients

Determine under performing radios from the QoE network baseline

Unsupervised Multi-Dimensional Clustering  
Maximize Inference

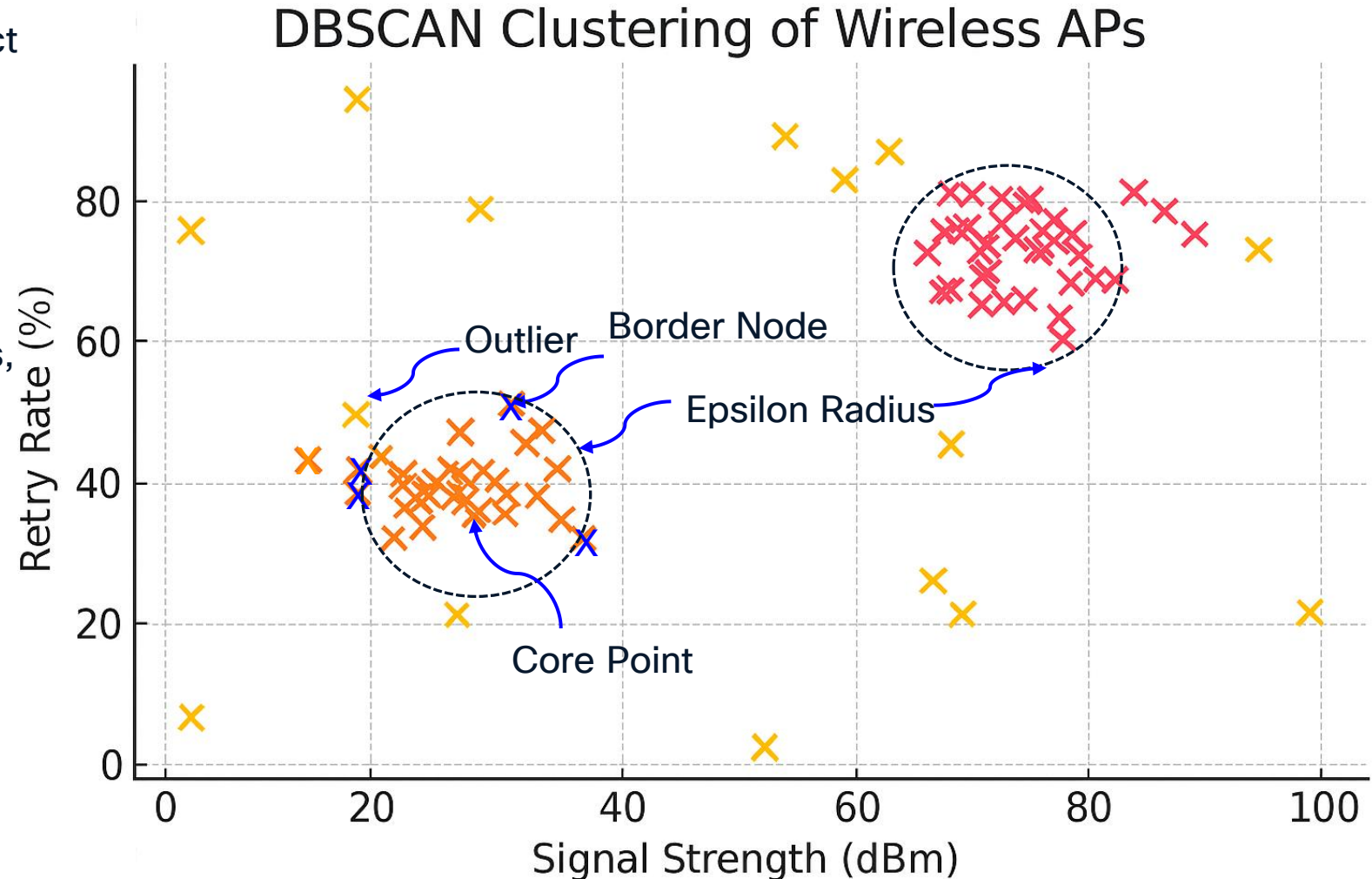
Supervised Learning Decision Tree

Insight Generation Associate Impacting QoE

# Multi-Dimensional QoE Clustering (DBSCAN)

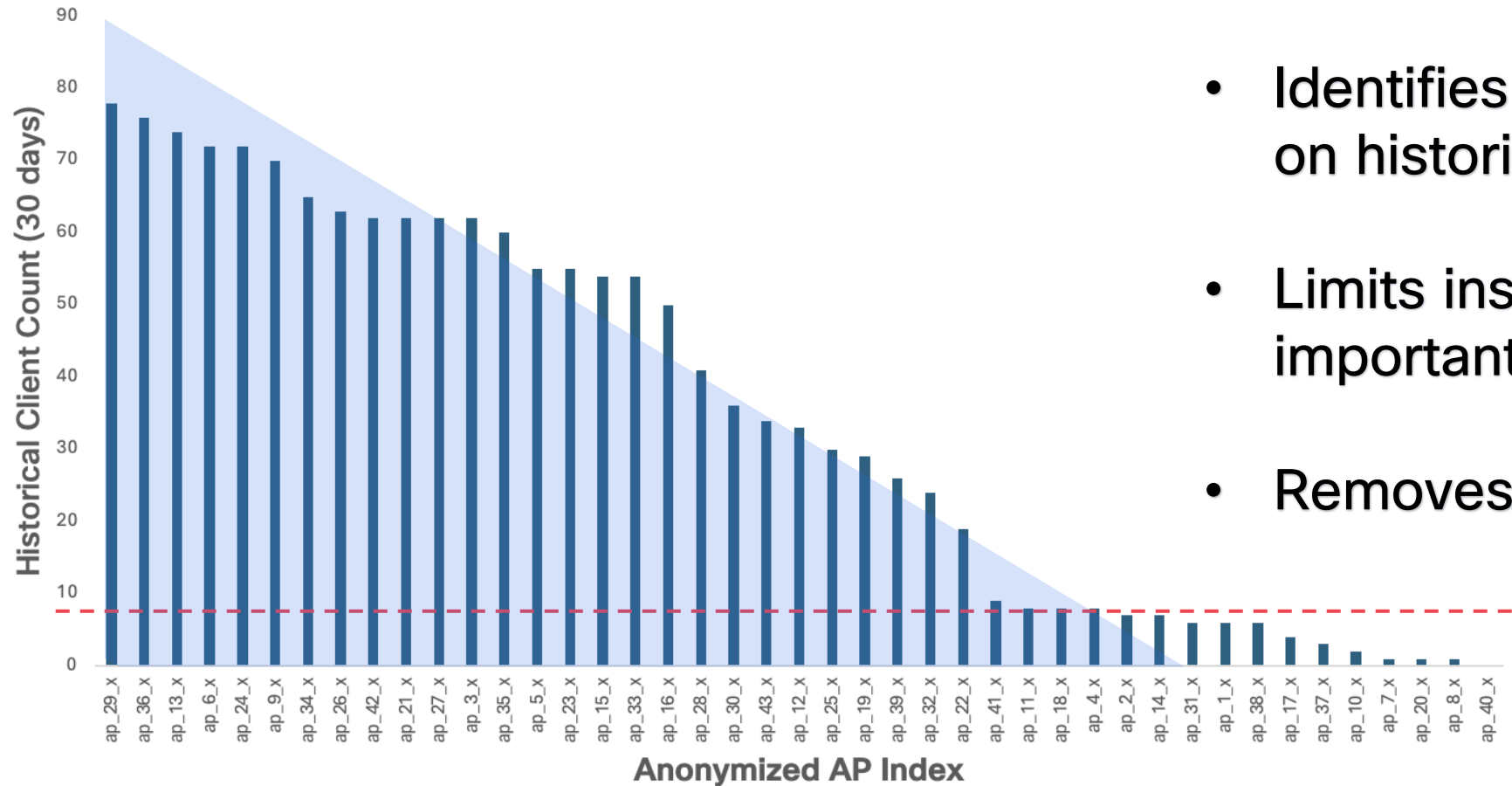


- Unsupervised clustering algorithm to detect patterns
- Better efficacy to identify arbitrary-shaped clusters (nesting) & outliers
- Optimal for Noisy data, spatial distributions, non-globular clusters.
- Identified Wireless Radios with suboptimal QoE Class
  - High Noise Floor
  - Lower SNR
  - Higher 802.11 Retries
  - Lower MCS Rates



# Phase 1: Prune AP List

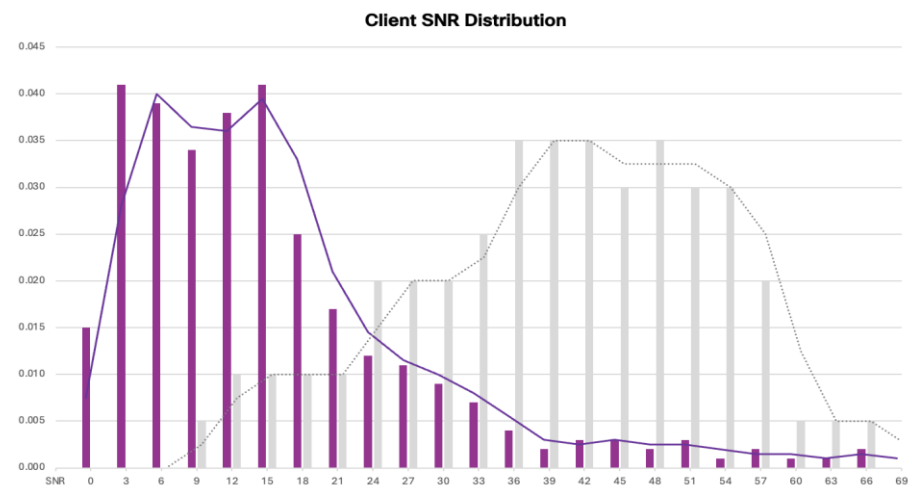
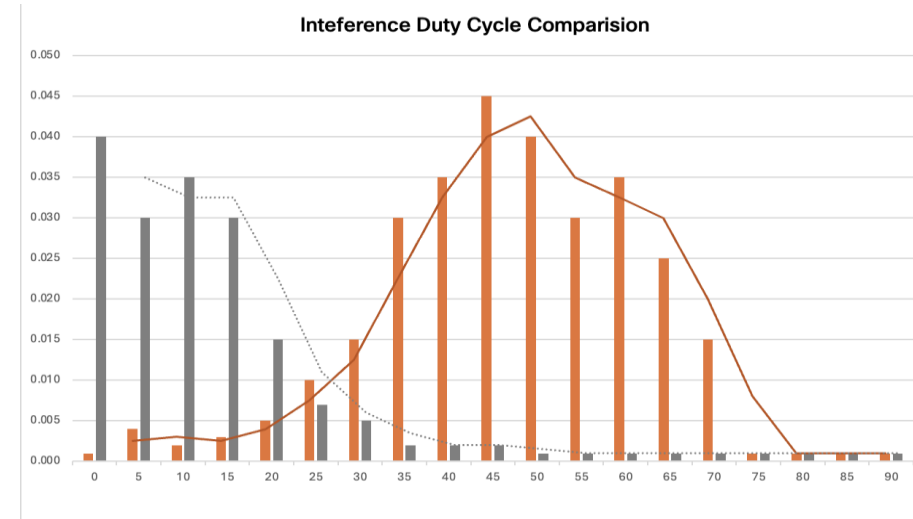
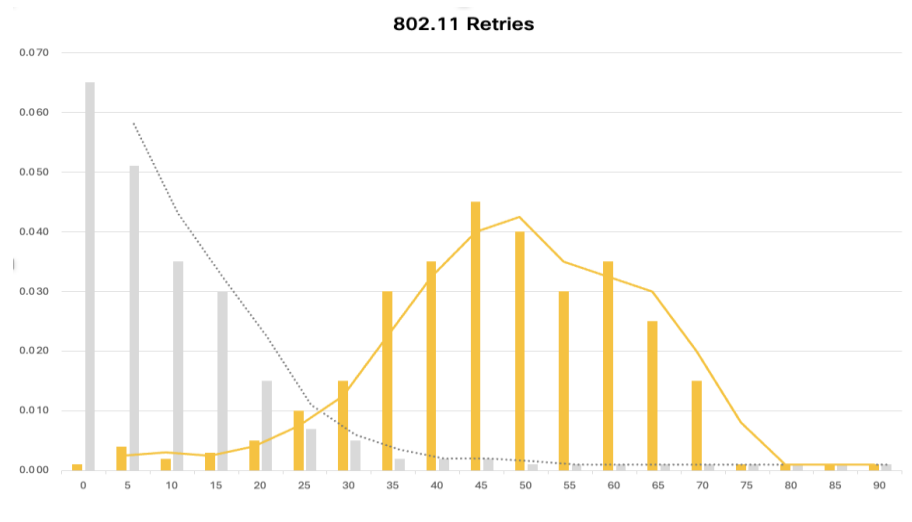
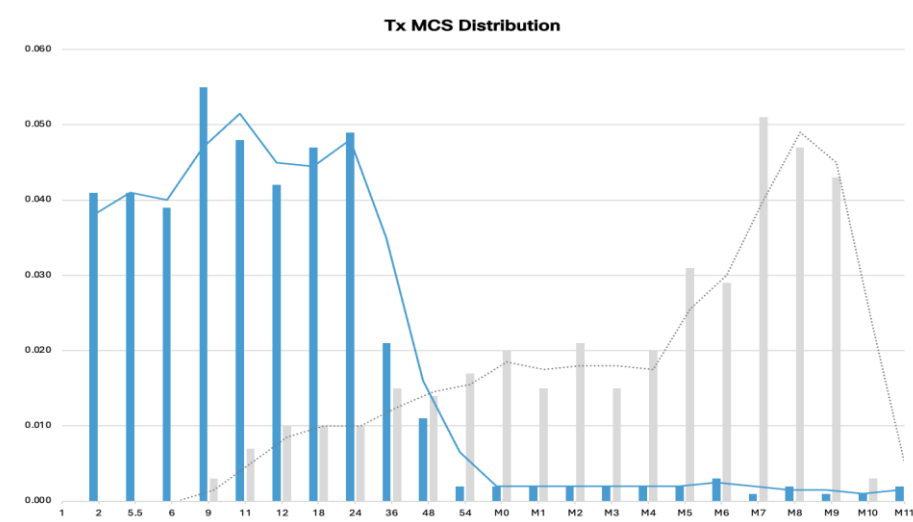
Constrain analysis within the top radios in the network



- Identifies top radios based on historical data
- Limits insights to the important radios
- Removes inherent bias

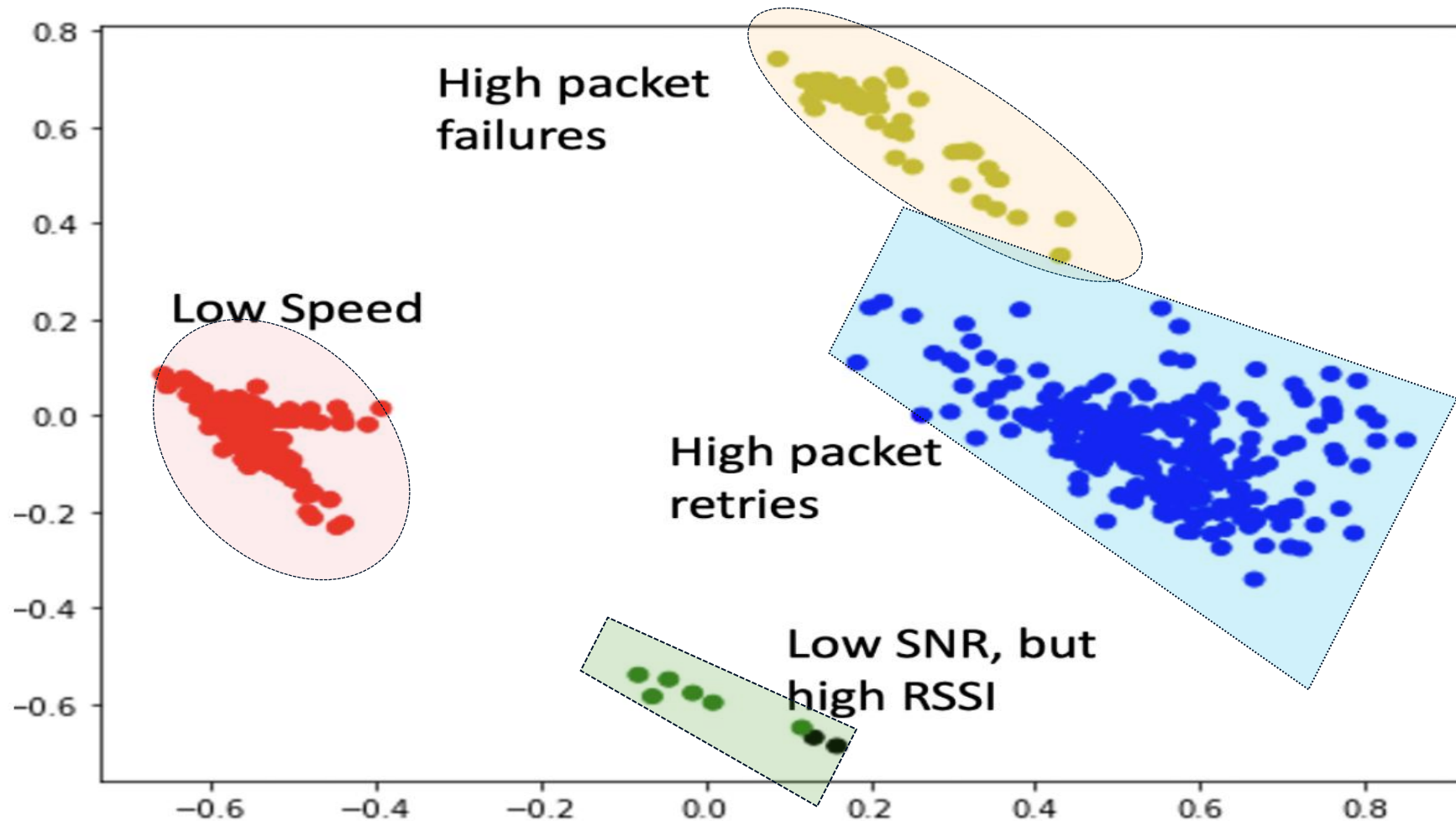
# Phase 2: Model Training (QoE Metrics)

Identify Underperforming Radios Per QoE Class



# Phase 3: Automatic Radio Clustering

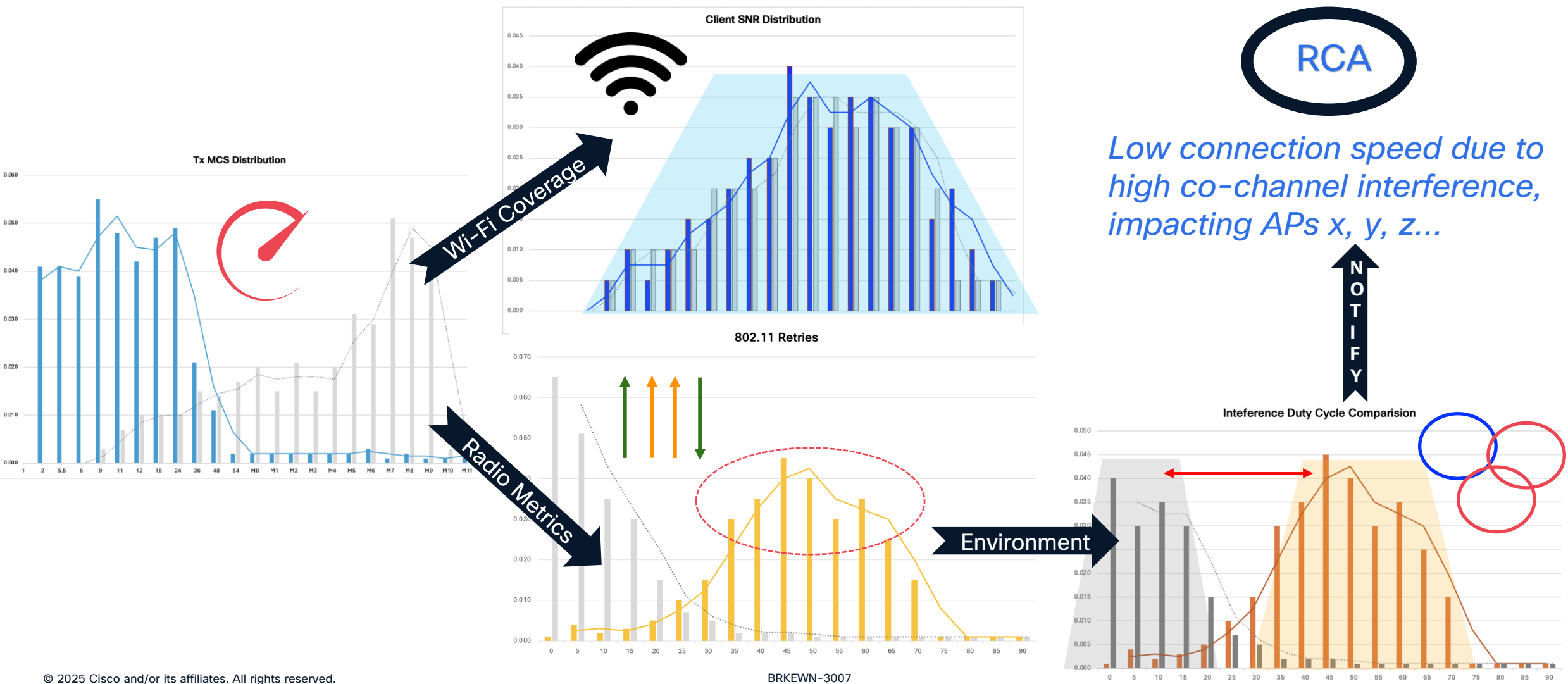
Group radios with similar QoE degradation



- Apply DBSCAN for multi-dimensional clustering
- Groups radios exhibiting similar deprivation on a specific QoE KPI
- Supports candidate ap redundancy to maximize inference

# Phase 4: Supervised Learning – QoE Correlation

Utilize Random Forest to assess main QoE attributing to poor connection



# AP Performance Advisories

Highlights primary reason impacting performance

Clusters radios experiencing similar issues

Flags KPI deviation from baseline

Impacted Devices

Trends and Insights / High Co-channel Interference at 2.4 GHz

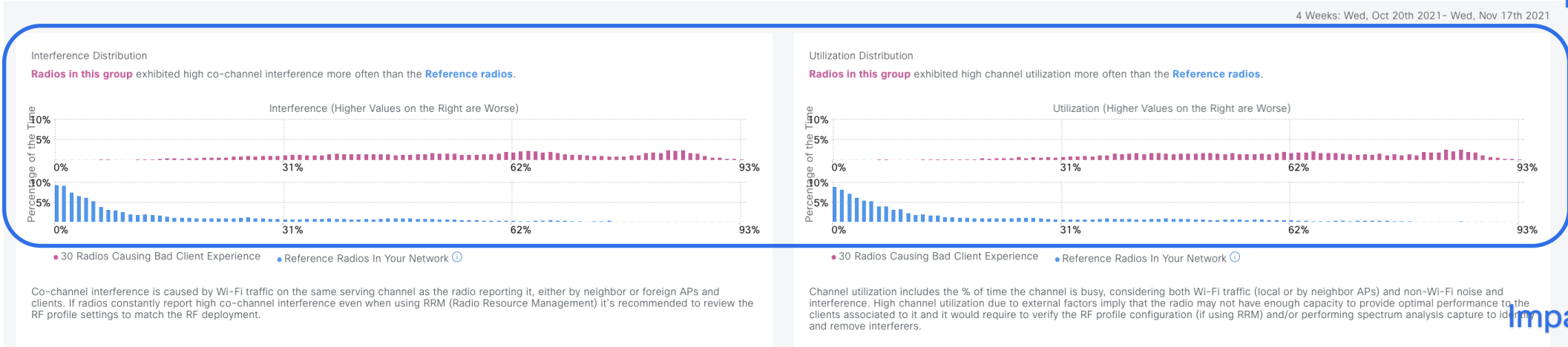
High Co-Channel Interference At 2.4 GHz

Radios with co-channel interference and channel utilization higher than the reference, possibly indicating a sub-optimal channel plan. ⓘ

ⓘ Is this Insight helpful?

9 Radios6 Buildings

TOP 1 RADIOS AFFECTING CLIENT EXPERIENCE  
SFO15...24-02



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Hardware RMA/Refresh



Business Vertical **Education**

Site Location **Oceania**

Managed Sites **38**

AP Count **2987**

Wireless Clients **Avg ~18000, Peak 28663**

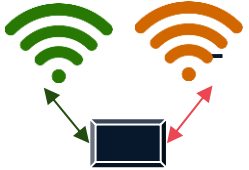
# Imbalanced Cell Sizes: A Growing Challenge in Wireless Networks

- **Areas of Concerns**



- **Primary:** Frequent coverage holes reported

- Predominantly observed on the large lecture halls and auditoriums



- **Secondary:** Roaming failures reported in cafeteria and lab/office spaces

- **Analysis**

- Exact same TxPower Control Threshold (-70dBm) configured across all 38 buildings!
    - Driving coverage holes in auditoriums due to aggressive TxPower backoff
    - Roaming failures attributed mainly due to sticky clients in labs and offices

# Initial Recommendation To Customer

Please customize TPC thresholds for each of your 38 buildings!



# TxPower Control Threshold

Stronger  
Threshold

-45

-50

-55

-60

-65

System  
Default

-70

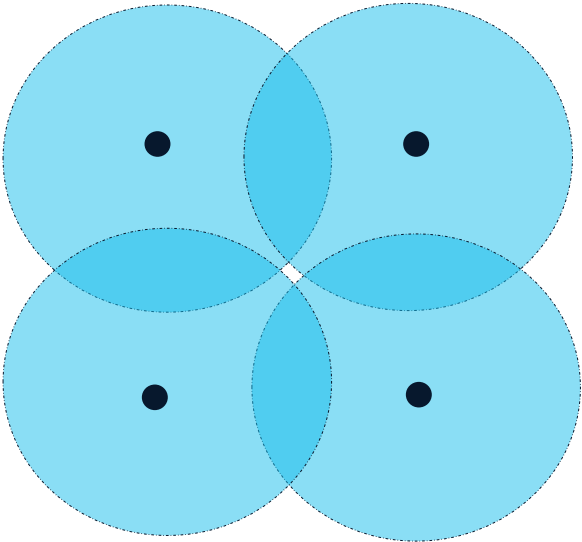
-75

-80

-85

-90

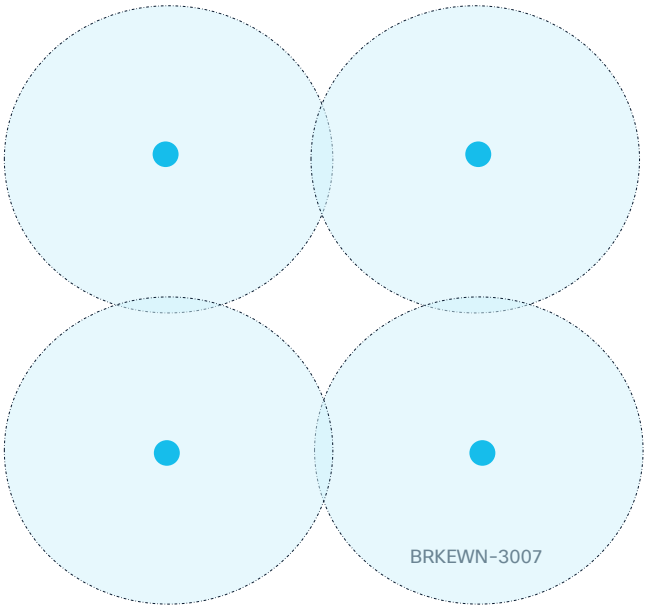
Weaker  
Threshold



Dense Wi-Fi Deployment



Minimize Co-Channel Contention



Avoid Coverage Holes



Sparse Wi-Fi Deployment

# Optimal Tuning Requires RF Expertise!



Radio transmit power range  
(dBm)



Power Control Thresholds



Edit RF Profile

General802.11RRMAdvanced802.11ax

GeneralCoverageTPCDCA

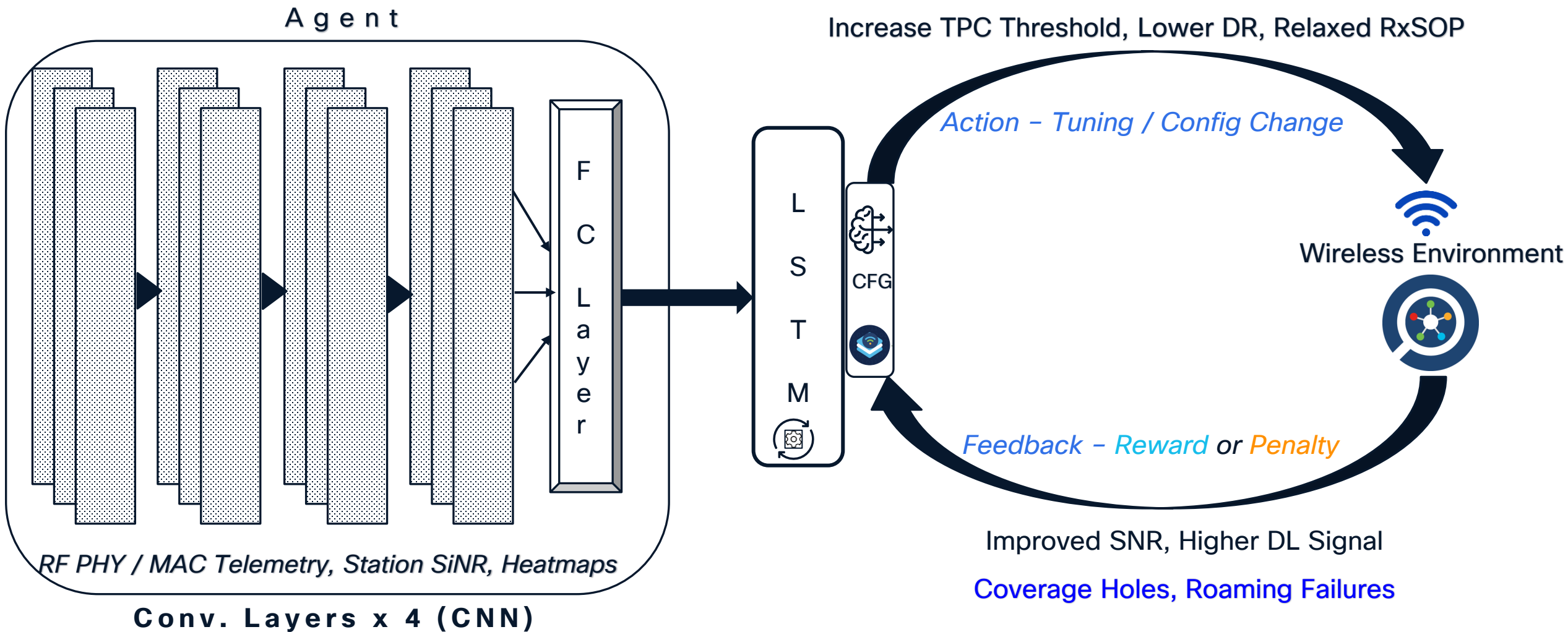
Transmit Power Control

Maximum Power Level(dBm)\*30

Minimum Power Level(dBm)\*-10

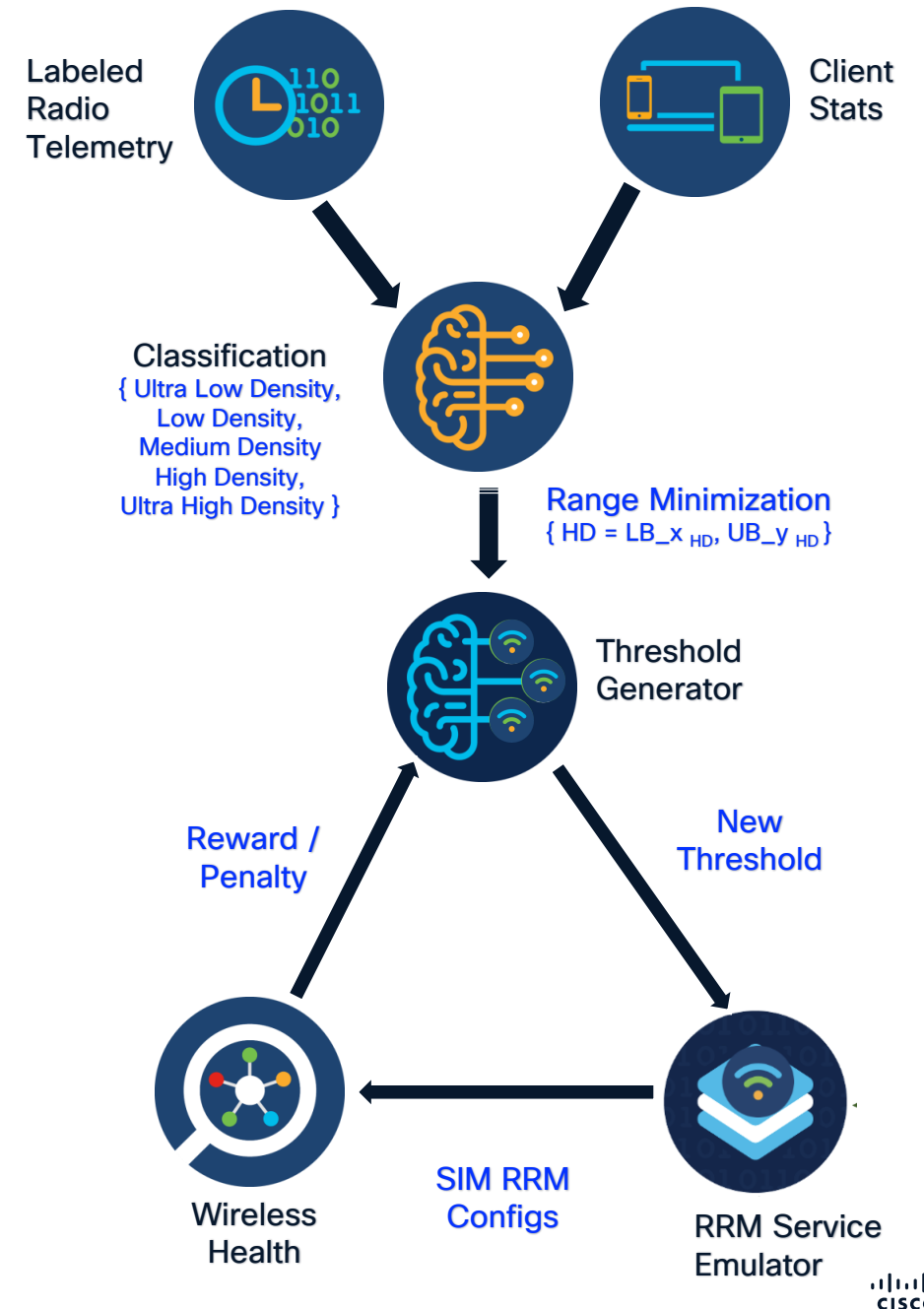
Power Control Threshold(dBm)\*-65

# Reinforcement Learning in Wireless Environments



# AI Generated TPC Threshold

- Influences **amount of cell overlap** between the adjacent APs
- Needs to get tuned based on overall RF density and associated clients
- AI optimizes threshold leveraging combination of SL & RL
  - Model training is conducted based on labeled data set to achieve power control threshold range minimization
  - SL determines threshold range; RL is enforced to iterate through multiple instances of Transmit Power Control service
  - Threshold generator determines optimal Power Control threshold that maximizes RF health of radios and clients



# Performance Improvements

AI-Core Engine recommended altering TPC thresholds with customized settings for 21 buildings/sites!!

## Insights

- Consider changing the configured Busy Hours for RRM to be more effective.
- Consider changing the configured Channel Width for improved performance.
- Consider changing the configured TPC Threshold for improved coverage.

### Observed Busy Hours

Start Time 7:00 AM (PDT) → 09:00 AM (PDT)  
End Time 7:00 PM (PDT) → 05:30 PM (PDT)

Based on analyzing the wireless client association and usage patterns, we recommend this busy hour interval.

### Channel Width

Channel Width → DBS with Max width of 80 MHz

Based on analyzing your neighbor density and client types, we recommend using Dynamic Bandwidth Selection (Auto Channel Width) with a max bandwidth of 80 MHz

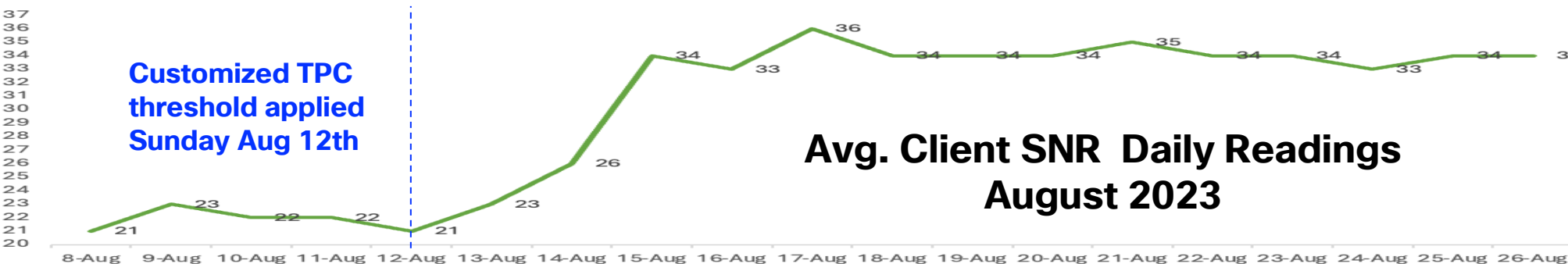
### TPC Power Threshold

Threshold Value -67 dBm → -62 dBm

Based on analyzing the neighbor density and client coverage hole events, we recommend the TPC Threshold to increase 5 dB. This will improve the coverage in the building.

When would you like to apply these Recommendations?

No Coverage Holes reported after 1 week



Significant  
(+8dB) gain in  
Client SNR

# Diverse Insights for diverse environments

| Business Vertical         |  |  |  |
|---------------------------|-----------------------------------------------------------------------------------|-------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------|
|                           | Financial Services                                                                | Retail                                                                              | Education                                                                           |
|                           | Country                                                                           | North America                                                                       | Oceania                                                                             |
|                           | Total APs                                                                         | 217                                                                                 | 2,987                                                                               |
|                           | Avg. Clients                                                                      | ~1,700                                                                              | ~18,000                                                                             |
| AI-Driven Config Insights |                                                                                   |                                                                                     |                                                                                     |
| Busy Hours                | 8:30am – 5:30pm (UTC+2)                                                           | 3pm – 10pm (UTC-5)                                                                  | 7:00am – 2:30pm (UTC+13)                                                            |
| 5GHz DBS_Max              | 40MHz                                                                             | 20MHz                                                                               | 80MHz                                                                               |
| FRA                       | Yes                                                                               | Yes                                                                                 | Yes                                                                                 |
| TPC_Thresh                | -65dBm                                                                            | -60dBm                                                                              | -75dBm                                                                              |
| Enforce PSC               | N/A                                                                               | Yes                                                                                 | N/A                                                                                 |

# Leading to Performance Improvements



Business  
Vertical

Financial Services

Retail

Education

Country

Europe

North America

Oceania

## Improvements in the Wireless KPIs

Wireless  
Performance

51 → 94

Before After

34 → 70

Before After

17 → 91

Before After

Config  
Updates

85% Reduction

79% Reduction

83% Reduction

Stable Wi-Fi

Client SNR

38 dB (+9 dB)

(39 dB) (+11 dB)

33 dB (+8 dB)

Maximize  
Performance

Interference

37% Reduction

56% Reduction

65% Reduction

Best Capacity

# Outlook



How can AI support one-click client troubleshooting?



How can AI adapt to the challenges of latest standards?



How can AI provide insights and auto-tune configurations?



How can AI simplify upgrades and reduce downtime?



How can AI enable auto onboarding of new APs and RMAs?

# Key Takeaways



AI provides tangible benefits for Cisco Wireless customers



There is no cookie cutter solution that fits all use-cases



We are truly stepping into the next generation Wi-Fi revolution!!!

# Complete your session evaluations



**Complete** a minimum of 4 session surveys and the Overall Event Survey to claim a Cisco Live T-Shirt.



**Earn** up to 800 points by completing all surveys and climb the Cisco Live Challenge leaderboard.



**Level up** and earn exclusive prizes!



**Complete your surveys** in the Cisco Live Events app.

# Continue your education



**Visit** the Cisco Stand for related demos



**Book** your one-on-one Meet the Expert meeting



**Attend** the interactive education with Capture the Flag, and Walk-in Labs



**Visit** the On-Demand Library for more sessions at [www.CiscoLive.com/on-demand](https://www.CiscoLive.com/on-demand)

Thank you

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