

ATLANTA, GA OCTOBER 11-14



UNLEASHTHE POWER OF IMITLESS CONNECTIVITY





Wireline Access Network

Upstream OFDMA Anomaly Detection and Triaging

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Upstream OFDMA

Initial deployments

- OFDMA is being turned on by many operators in the field

PNM metrics

-~8 new PNM features

US RXMER

- Measured at CMTS, per CM

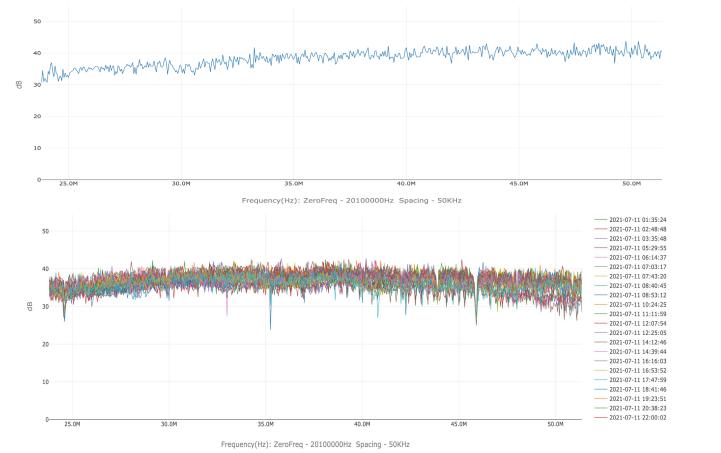
First views of an OFDMA Upstream data set



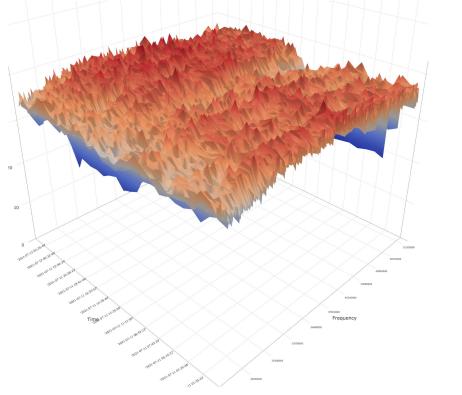
US RxMER Observations



Upstream RxMER



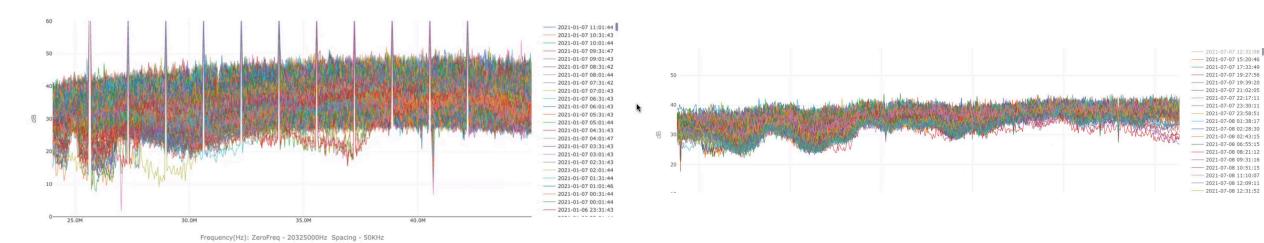
RxMER captures over time



US RxMER Observations



Variations and Impairments



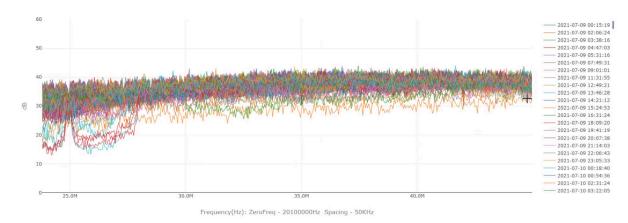
High variation over time

Lower variation but impedance mismatch is observed

US RxMER Observations



Outliers



60 ----- 2021-07-09 13:15:54 - 2021-07-09 15:36:00 - 2021-07-09 15:57:47 2021-07-09 18:37:34 2021-07-09 19:31:29 2021-07-09 20:28:40 2021-07-09 22:57:36 - 2021-07-10 00:08:08 2021-07-10 01:08:50 - 2021-07-10 01:53:28 2021-07-10 02:58:35 2021-07-10 03:08:55 2021-07-10 05:10:20 2021-07-10 05:29:04 2021-07-10 09:19:24 Frequency(Hz): ZeroFreq - 20100000Hz Spacing - 50KHz

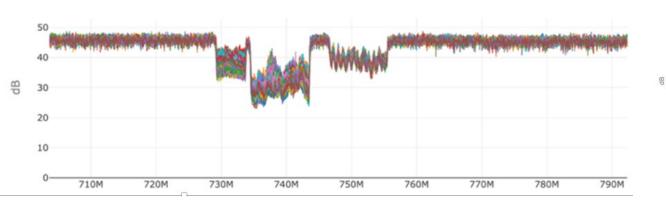
Ingress-like impairments on lower frequency end

Outlier RxMER captures

OFDM vs OFDMA



Compare DS RxMER with US RxMER



2021-01-07 09:31:47 2021-01-07 09:01:4 2021-01-07 08:01:44 2021-01-07 07:31:42 2021-01-07 07:01:43 2021-01-07 06:31:4 2021-01-07 06:01:4 2021-01-07 05:31:4 2021-01-07 05:01:4 2021-01-07 04:31:43 2021-01-07 04:01:47 2021-01-07 03:31:43 2021-01-07 03:01:43 2021-01-07 02:31:43 2021-01-07 01-31-44 2021-01-07 01:01:46 2021-01-07 00:01:44 2021-01-06 23:31:43 Frequency(Hz): ZeroFreq - 20325000Hz Spacing - 50KHz

Downstream has low variance

Upstream has high variance

- Impairments/anomalies on downstream are easy to characterize
 - Easy to categorize patterns, label samples and train a machine learning model
- Upstream does not have clear features to latch onto

2021-01-07 11:01:44



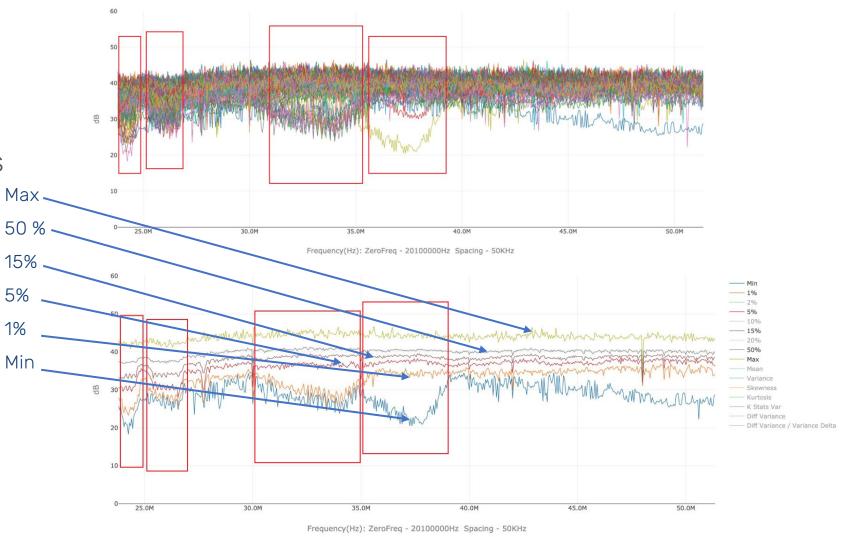
- Percentiles
- Variance
- Skewness
- Kurtosis
- MER Time series
- Time Clustering of data





Percentiles

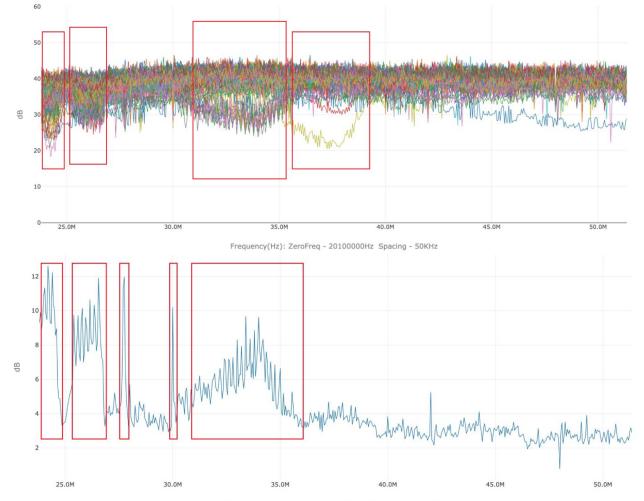
- Distribution of MER values
- Intermittent issues
- Persistent issues





Variance

- A statistical measurement of the spread between numbers in a dataset
- Calculated for each subcarrier
- A good issue indicator
- Cannot differentiate issue types
- Needs research on setting thresholds



Frequency(Hz): ZeroFreq - 20100000Hz Spacing - 50KHz



Skewness

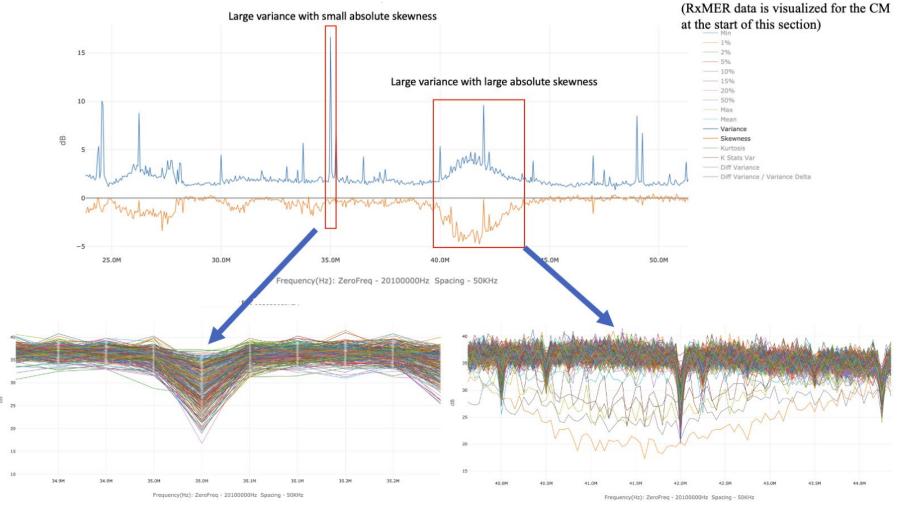
- A measure of the asymmetry of the probability distribution
- Can identify intermittent issues
- The absolute value of skewness is used



Frequency(Hz): ZeroFreq - 20100000Hz Spacing - 50KHz



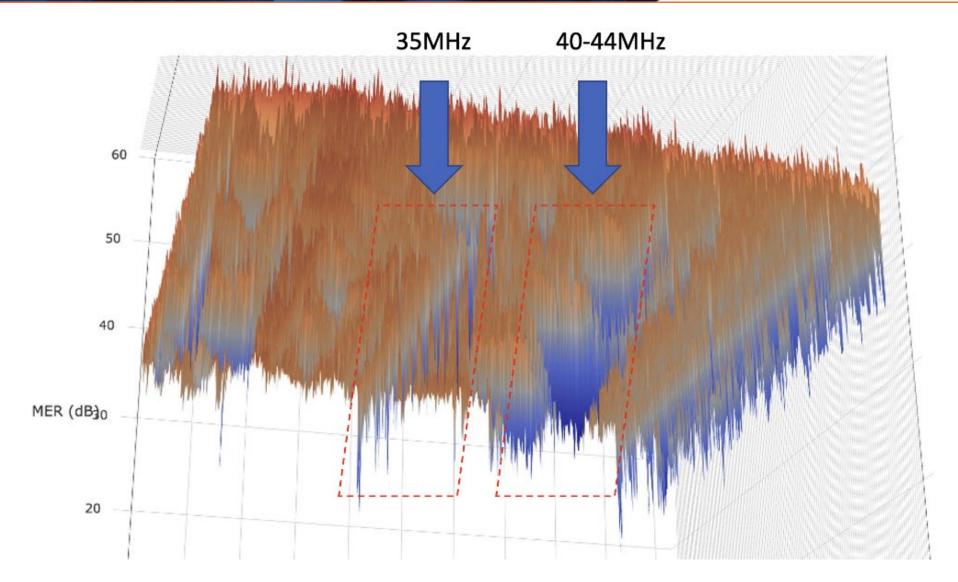
Identifying intermittent vs persistent issues



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Persistent Issues vs Intermittent







Kurtosis

- A measure of the "tailedness" of the probability distribution
- Higher kurtosis corresponds to greater extremity of deviations
- Useful when combining with variance and skewness



MER as time series

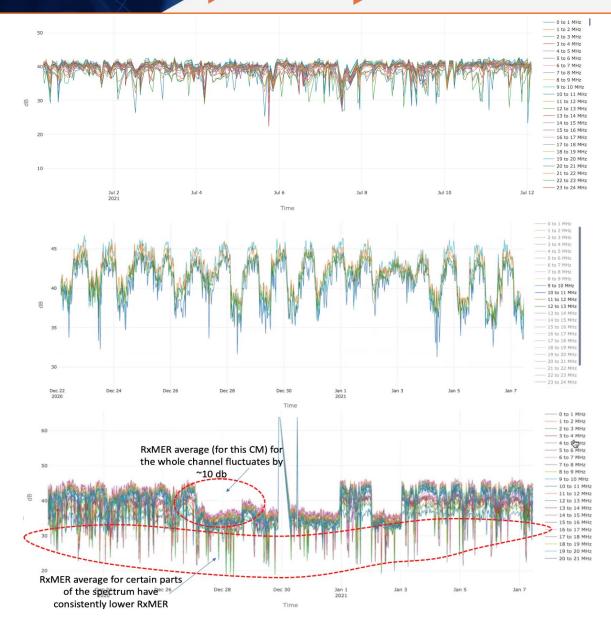


Time Series

Average MER values for each incremental 1MHz on the OFDMA channel

Daily variation pattern

Significant abnormal variations observed on MER time series



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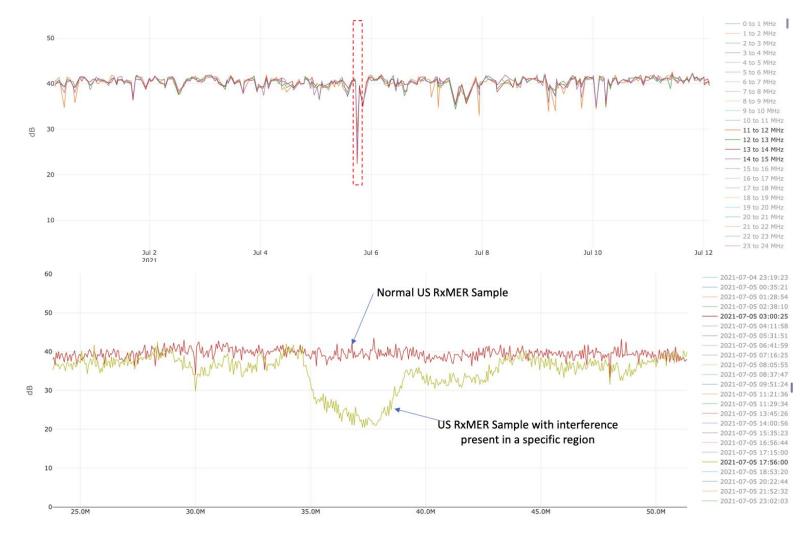
MER as time series



Time Series

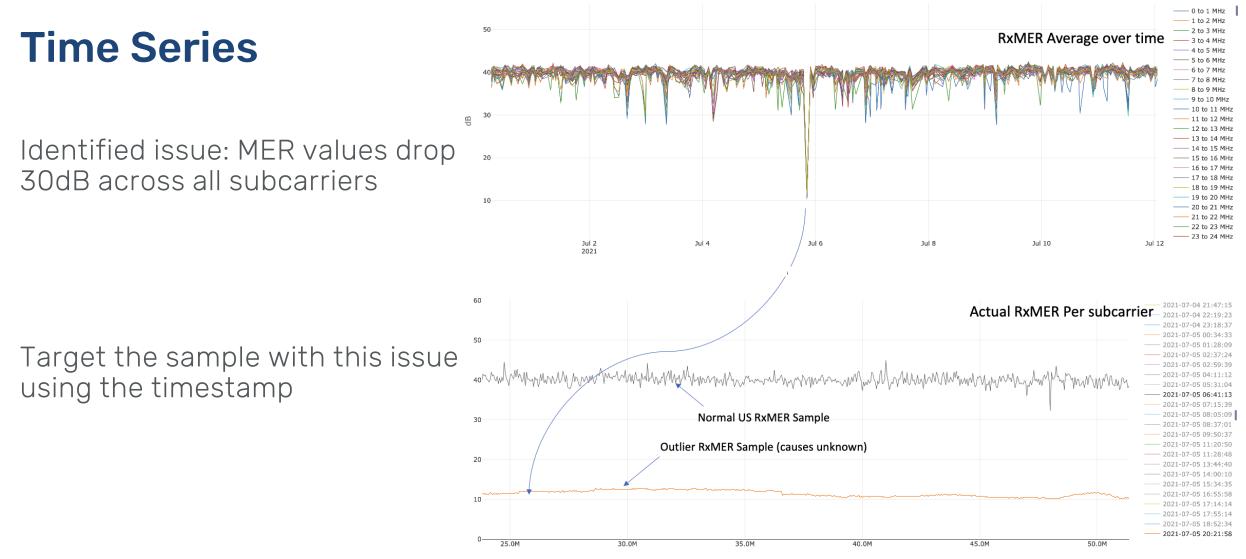
Identified issue: MER values drop ~18dB

Target the sample with this issue using the timestamp



MER as time series





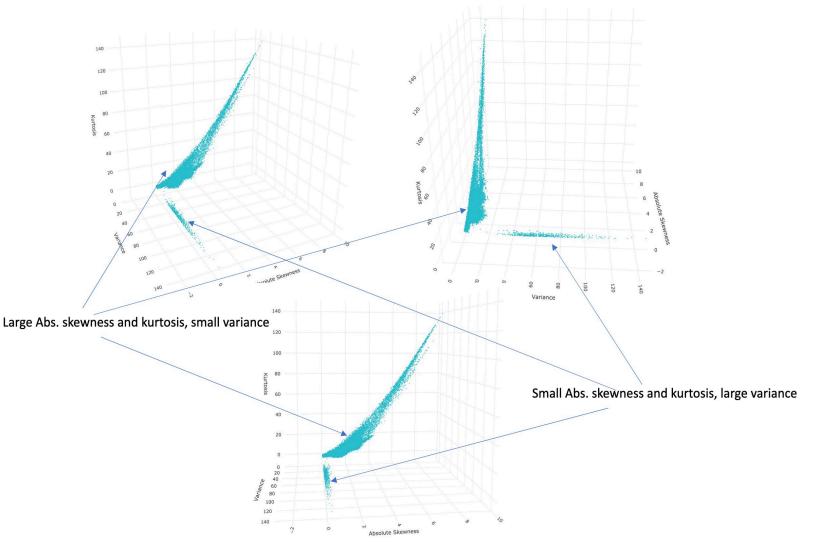
Frequency(Hz): ZeroFreq - 20100000Hz Spacing - 50KHz

Experimenting with statistics



Clustering Analysis

- Natural clusters of the statistics of subcarriers
- Potential ways to infer thresholds
- Potential usage of centroids
- Possible feature extraction methods



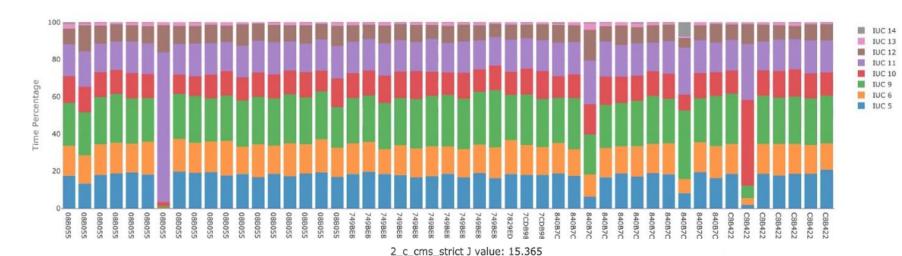
Grouping the samples captured over time



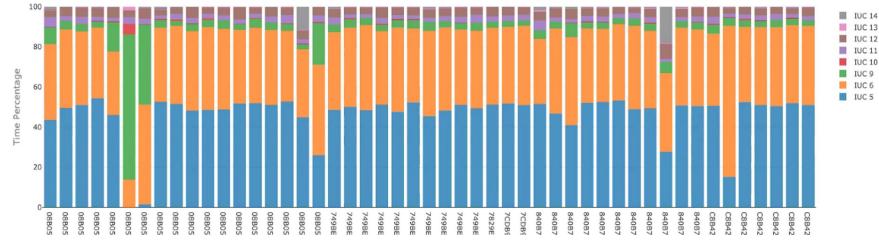
Time Clustering

PMA Use case

- Improved OFDMA robustness
- Capacity gains



2_b_cms_strict J value: 32.532

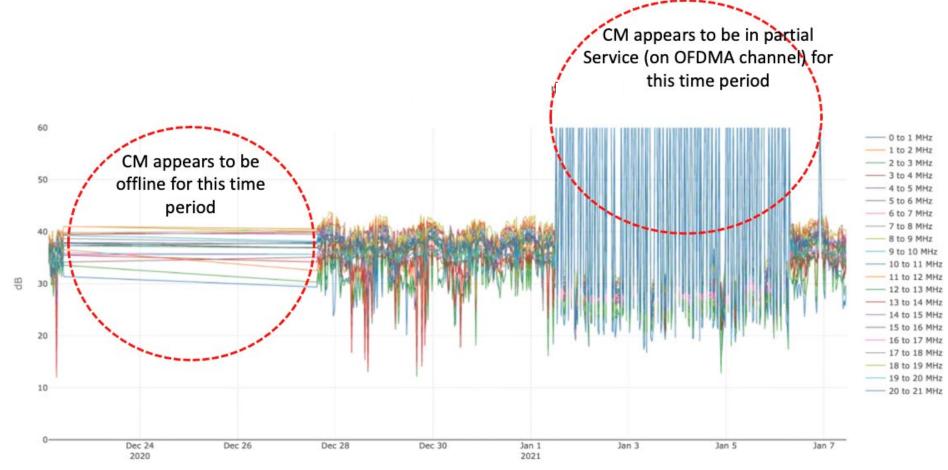


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Data capturing issues



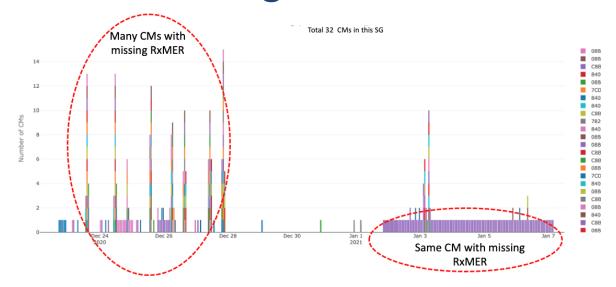
US RxMER Measurement Discontinuities

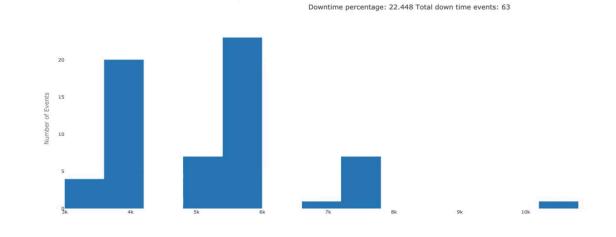


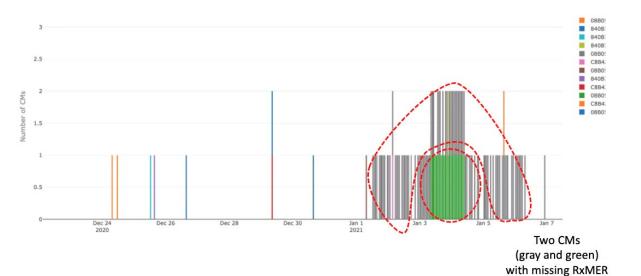
Data capturing issues



CMs Missing RxMER across a Node





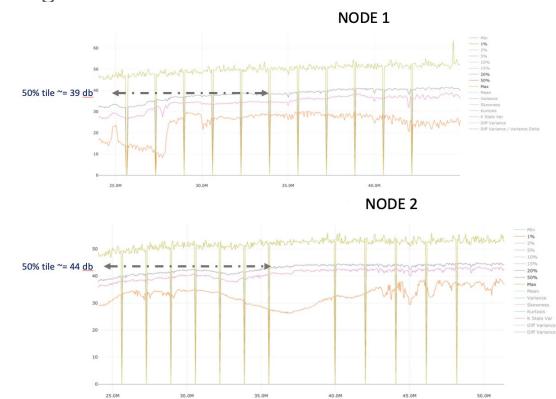


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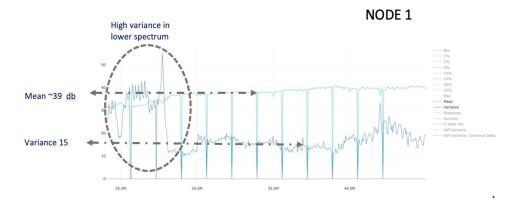
CM Health Score

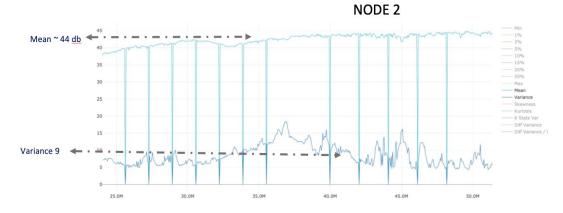
Individual parameters from a CM, weighted together



Node Health Score

Aggregated metrics from all CMs \rightarrow Node upstream health







US RxMER Data Analytics Application

- All the metrics and methods can
 - Identify troubled CMs
 - Identify troubled Nodes
- Prioritize maintenance for CMs/Nodes

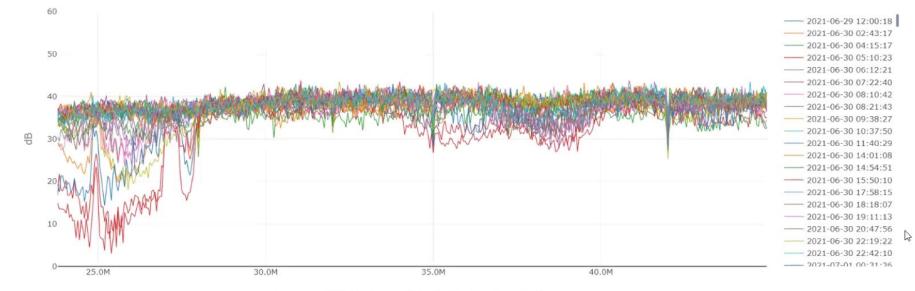
CM MAC	Spacing	First Active Sub- carrier	First Active Sub- carrier Frequency	Interface Number	SG Name ⊥⊺	Average Variance (lower spectrum) ⊥	Average Variance (higher spectrum)	Average Skewness (lower spectrum)	Average Skewness (higher spectrum)	Average Kurtosis (lower spectrum)	Average Kurtosis (higher spectrum)	Downtime Percentage	Gap Time Percentage	Show Data
08B0	50	74	24025000	34259153	AM	182.14	161.22	0.92	0.93	-0.38	-0.3	22.448	33.036	Show Data
08B0	50	74	24025000	34259153	АМ	46.21	32.62	1.81	1.79	6.68	7.21	6.633	4.719	Show Data
7CDB!	50	74	24025000	51003593	АМ	29.22	25.73	1.54	1.43	9.03	6.4	4.081	2.679	Show Data
08B05	50	74	24025000	34259153	АМ	27.42	24.05	-1.56	-2.21	5.34	8.64	0	0	Show Data
7CDB!	50	74	24025000	51003593	AM	26.93	35.09	-0.45	-0.44	-0.54	-1.08	0	0	Show Data
94917	50	74	24025000	51003593	AM.	26.02	24.24	0.38	0.29	6.28	3.55	1.148	0.256	Show Data
840B7	50	74	24025000	34259153	AM	25.03	18.81	-0.33	-1.03	2.16	5.93	0.255	4.591	Show Data
7CDB!	50	74	24025000	51003593	АМ	23.55	29.39	-0.45	-0.37	-0.25	-1.12	0	0	Show Data
840B7	50	74	24025000	51003593	AM	23.34	22.06	0.07	0.17	4.94	2.01	0.765	0.255	Show Data
840B7	50	74	24025000	34259153	AM.	22.81	25.35	-1.17	-2.3	3.71	9.84	0	2.041	Show Data





Anomaly Detection

- Define Anomaly Categories
- Anomaly Detection Methods
- Correlation of Different Measurement data



Frequency(Hz): ZeroFreq - 20100000Hz Spacing - 50KHz



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Thank You!

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