

# Introduction:

This document outlines the data structure for our 5G Home Score analysis, which assesses 5G Home WiFi performance by integrating customer-related data from multiple tables (Figure 1).

The goal is to develop a scoring mechanism that combines weighted features to indicate overall WiFi performance."

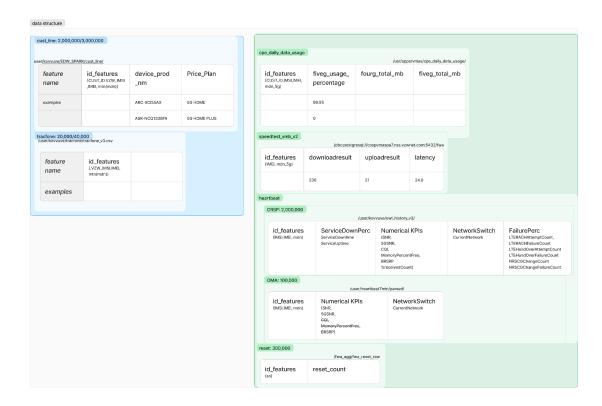


Figure 1 5G home score Profile.

# **Data Inventory**

Main Table: cust\_line

# Description:

This table serves as the primary repository for all 5g\_home\_wifi customers, encompassing essential features such as <u>cust\_id</u>, <u>imsi</u>, <u>imei</u>, and <u>mdn</u>. It also includes other pertinent attributes like <u>price\_plan</u> and <u>device\_product\_name</u>.

## Details:

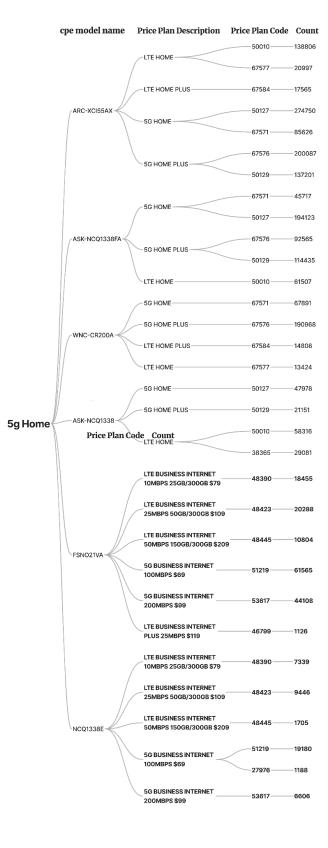
**device\_product\_name:** Indicates the type of Verizon internet gateway router associated with the customer, such as ASK-NCQ1338FA, FSNO21VA and ARC-XCI55AX.

cpe_model_name	count
ARC-XCI55AX	870396
ASK-NCQ1338FA	521629
WNC-CR200A	257445
FSNO21VA	166187
ASK-NCQ1338	156894
NCQ1338E	51843

**Price\_plan\_description:** Specifies the customer's subscription plan, such as "<u>5G Home</u>" and "<u>5G Home</u>" <u>Plus</u>," each with unique characteristics such as speed, video streaming quality, and warranty duration.

**Price\_plan\_code:** further details of price\_plan\_description
The relationship between **device\_product\_name**,

Price\_plan\_description and Price\_plan\_code are shown
below



#### Tracfone:

In addition to Cust\_Line, roughly 20,000 customers come from prepaid tracfone.

## Data Usage Table:

cpe\_daily\_data\_usage

### Description:

This table captures <u>daily data usage metrics</u>, focusing on 5G data consumption. It contains numerical features such as <u>fourg\_total\_mb</u>, <u>fiveg\_total\_mb</u>, and <u>fiveg\_usage\_percentage</u>, reflecting the volume and proportion of data usage across different network generations.

#### Details:

**fourg\_total\_mb:** Volume of 4G data consumed by the customer.

**fiveg\_total\_mb:** Volume of 5G data consumed by the customer.

data\_usage: total Volume of data consumed by the customer.

**fiveg\_usage\_percentage:** Percentage of total data usage attributed to 5G connectivity.

# Speed test Table: speedtest\_vmb\_v2

# Description:

This table records speed-related test results, intermittently conducted for select customers. It includes features such as

<u>downloadresult</u>, <u>uploadresult</u>, and <u>latency</u>, representing download/upload speeds and network latency, respectively.

#### Details:

**downloadresult**: Download speed measured during speed tests.

uploadresult: Upload speed measured during speed tests.latency: Delay in network communication observed during tests.

'53617': {'Download': 200, 'Upload': 10, 'PPLAN\_DESC': '5G BUSINESS INTERNET 100MBPS \$99'},

'48390': {'Download': 10, 'Upload': 6,
'PPLAN\_DESC': 'LTE BUSINESS INTERNET 10MBPS
25GB/300GB \$79'},

'48423': {'Download': 25, 'Upload': 6, 'PPLAN\_DESC': 'LTE BUSINESS INTERNET 25MBPS 50GB/300GB \$109'},

'48445': {'Download': 50, 'Upload': 6, 'PPLAN\_DESC': 'LTE BUSINESS INTERNET 50MBPS 150GB/300GB \$209'},

```
'46799': {'Download': 25, 'Upload': 6,
'PPLAN DESC': 'LTE BUSINESS INTERNET PLUS
25MBPS $119'},
      '46798': {'Download': 10, 'Upload': 6,
'PPLAN DESC': 'LTE BUSINESS INTERNET PLUS
10MBPS $89'},
       }
vcg speeds = {
         '50010': {'Download': 50, 'Upload': 6, 'Latency':
100, 'PPLAN DESC':"LTE HOME"},
         '50011': {'Download': 50, 'Upload': 6, 'Latency':
100, 'PPLAN DESC':"LTE HOME"},
         '67577': {'Download': 25, 'Upload': 4, 'Latency':
100, 'PPLAN DESC':"LTE HOME"},
         '38365': {'Download': 25, 'Upload': 4, 'Latency':
100, 'PPLAN DESC':"LTE HOME"}, # Existing entries
         '67584': {'Download': 25, 'Upload': 4, 'Latency':
100, 'PPLAN DESC':"LTE HOME PLUS"},
         '65655': {'Download': 25, 'Upload': 4, 'Latency':
100, 'PPLAN DESC':"LTE HOME PLUS"},
         '65656': {'Download': 25, 'Upload': 4, 'Latency':
100, 'PPLAN DESC':"LTE HOME PLUS"},
         '50044': {'Download': 85, 'Upload': 10, 'Latency':
30, 'PPLAN DESC': "5G HOME"},
         '50055': {'Download': 85, 'Upload': 10, 'Latency':
30, 'PPLAN DESC': "5G HOME"},
         '50127': {'Download': 85, 'Upload': 10, 'Latency':
30, 'PPLAN DESC': "5G HOME"},
```

```
'50128': {'Download': 85, 'Upload': 10, 'Latency':
30, 'PPLAN DESC': "5G HOME"},
         '67571': {'Download': 50, 'Upload': 5, 'Latency':
30, 'PPLAN DESC': "5G HOME"},
         '67567': {'Download': 85, 'Upload': 10, 'Latency':
30, 'PPLAN DESC': "5G HOME"},
         '50129': {'Download': 85, 'Upload': 10, 'Latency':
30, 'PPLAN DESC': "5G HOME PLUS"},
         '67576': {'Download': 85, 'Upload': 10, 'Latency':
30, 'PPLAN DESC': "5G HOME PLUS"},
         '67568': {'Download': 300, 'Upload': 25,
'Latency': 30, 'PPLAN DESC': "5G HOME PLUS"},
         '50116': {'Download': 300, 'Upload': 50,
'Latency': 30, 'PPLAN DESC': "5G HOME PLUS"},
         '50117': {'Download': 300, 'Upload': 50,
'Latency': 30, 'PPLAN DESC':"5G HOME PLUS"},
         '50130': {'Download': 85, 'Upload': 10, 'Latency':
30, 'PPLAN DESC': "5G HOME PLUS"},
         '39425': {'Download': 300, 'Upload': 50,
'Latency': 30, 'PPLAN DESC': "5G HOME INTERNET"},
         '39428': {'Download': 300, 'Upload': 50,
'Latency': 30, 'PPLAN DESC': "5G HOME INTERNET"},
      }
```

## Heartbeat Tables: CRSP and OMA

## Description:

These tables monitor the connectivity and performance of 5G Home services, recording activities at frequent intervals (every 5 minutes for CRSP, and every 15 minutes for OMA). These tables contain the majority features used for 5g home Score.

#### CRSP:

Features include <u>ServiceDownPercentage</u>, <u>NetworkSwitch</u>, <u>SNR</u>, <u>5GSNR</u>, <u>CQI</u>, <u>MemoryPercentFree</u>, <u>BRSRP</u>, <u>4GRSRP</u>, and failure percentage metrics (<u>LTERACHFailurePerc</u>, <u>LTEHandOverFailurePerc</u>, and <u>NRSCGChangeFailurePerc</u>).

#### OMA:

Similar features to CRSP, excluding MemoryPercentFree and failure percentage metrics (LTERACHFailurePerc, LTEHandOverFailurePerc, NRSCGChangeFailurePerc). Both tables provide crucial insights into network stability, performance metrics, and potential issues affecting customer experience.

# Scoring Mechanism:

The scoring mechanism involves:

 Determining the individual feature scores for each feature, primarily based on their statistical ranking.

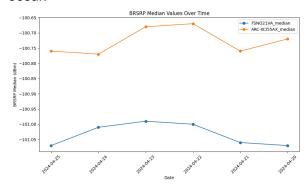
- 2. Aggregating feature score to Category score.
- Aggregating Category score to 5g Home score.

# Feature To FeatureScore using distribution statistics

## 1. Monthly distribution:

The statistics (1%, 50%, 99%) comes from previous 1 month distribution, and used to transform current day features into score. The reason is explain below using Example of BRSRP across various device models over several days:

While the daily statistics of BRSRP such as median, 1% percentile, and 99% percentile do not vary drastically day-to-day, there might be exceptions where significant variations occur.



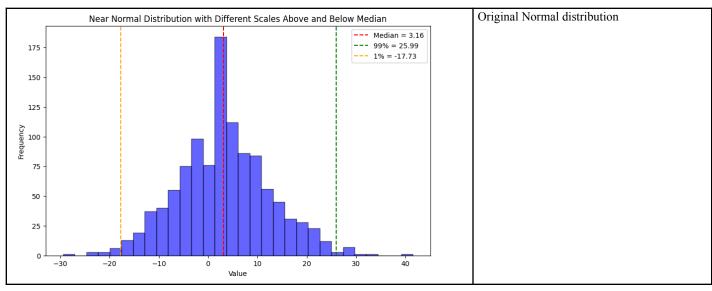
- To mitigate the risk of these outliers influencing the feature scoring unduly, adopting a one-month distribution period for calculating these statistics has been considered.
- Utilizing a month-long aggregation period for statistics will help in creating a more **robust** model, less susceptible to the occasional

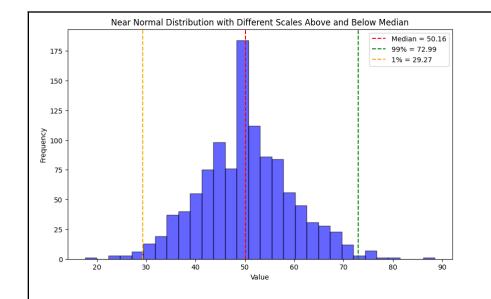
- variances that can occur in daily measurements.
- The continuous monitoring of these metrics will be essential to maintain the accuracy and relevance of the scoring mechanism.

#### 2. Normalization and Standardization:

In this section, we outline the scoring mechanism devised to transform a near-normal distribution feature into a standardized score range from 0 to 100. This mechanism aims to provide a meaningful representation of the distribution's characteristics while ensuring that extreme outliers are appropriately handled.

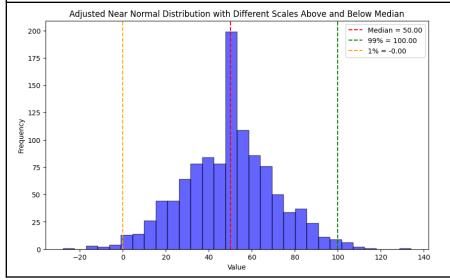
1.





Shift median to (50 Points):

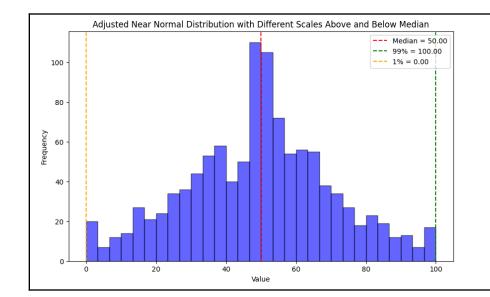
The median of the distribution is assigned a score of 50 points. This serves as a central reference point, indicating the typical or average value of the feature.



Scale [median, top 99%] -> [50,100] Scale [low1%, median] -> [0,50]

Percentiles 1% to 50%: The range between the 1st and 50th percentiles is uniformly mapped to a score range of 0 to 50 points. This evenly spreads values in the lower half of the distribution across the lower half of the score range.

Percentiles 50% to 99%: The range between the 50th and 99th percentiles is uniformly mapped to a score range of 50 to 100 points. This evenly spreads values in the upper half of the distribution across the upper half of the score range.



#### Cap:

If lower than 1%, assign as 0 If higher than 99%, assign as 100

99th Percentile Score (100 Points): The value at the 99th percentile of the distribution is assigned a score of 100 points. This ensures that extreme outliers are capped at the maximum score, representing exceptionally high values.

1st Percentile Score (0 Points): The value at the 1st percentile of the distribution is assigned a score of 0 points. This ensures that extreme outliers are capped at the minimum score, representing exceptionally low values.

#### 3. Advantage of standardizing-normalizing over Direct Percentile Scoring:

- 1. In a normal distribution, most data points cluster around the mean.
- 2. By standardizing-normalizing, the scores of values near the mean (which represent most of the data) change little relative to each other.
- 3. This method reduces sensitivity to small changes near the median. Small differences in feature values do not lead to disproportionate score changes.

#### 4. Interpretation of Scores:

A score of 10 indicates that the value of the feature falls within the lower half of the distribution but **closer to the extreme lower tail,** suggesting a relatively low value.

A score of 50 indicates that the value of the feature is at the median of the distribution, representing an average value.

A score of 75 indicates that the value of the feature falls within the upper half of the distribution but **not in the extreme upper tail**, suggesting a relatively high value.

A score of 100 indicates that the value of the feature falls within the highest 1% of the distribution, suggesting an exceptionally high value or extreme outlier.

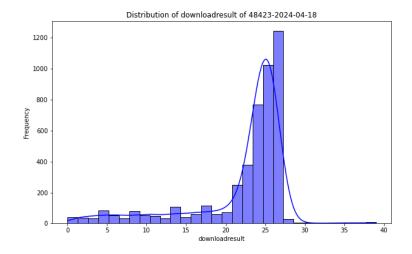
### 5. Features follows this method to transform

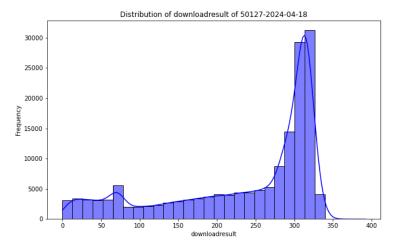
#### feature to score

```
networkSignalScore = { "4GRSRP", "BRSRP", "CQI", "SNR", "5GSNR" }
    dataScore= {
"5g_uptime","fiveg_usage_percentage",
"data_usage" }
```

# Feature To FeatureScore using price plan threshold

Instead of using statistics (1%, 50%, 99%) from the feature distribution, this method uses the threshold defined in the price plan advertisement, as shown below.





speed\_threshold\_dict = {

'51219': [0,100,150],

'27976': [0,100,150],

'53617': [0,200,300],

'48390': [0,10,15],

'48423': [0,25,40],

'48445': [0,50,75],

'46799': [0,25,40],

'46798': [0,10,15],

'50010': [0,50,70],

'50011': [0,50,70],

'67577': [0,25,40],

'38365': [0,25,40],

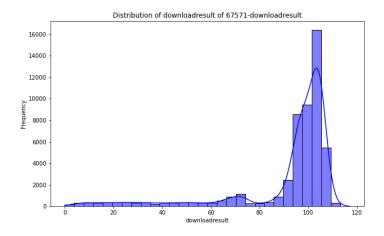
'67584': [0,25,40],

```
'65655': [0,25,40],
'65656': [0,25,40],
'50044': [0,300,400],
'50055': [0,300,400],
'50127': [0,300,400],
'50128': [0,300,400],
'67571': [0,100,150],
'67567': [0,300,400],
'50129': [0,300,400],
'67576': [0,300,400],
'67568': [0,1000,1500],
'50116': [0,1000,1500],
'50117': [0,1000,1500],
'50130': [0,300,400],
'39425': [0,1000,1500],
'39428': [0,1000,1500],
```

## 1. Interpretation:

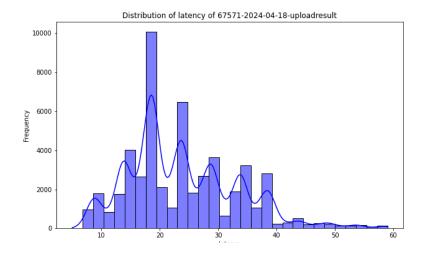
}

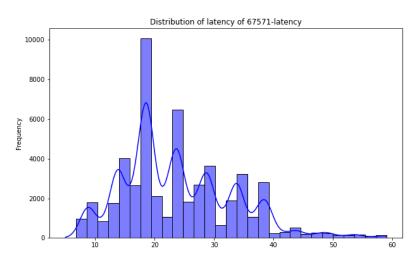
Score 50 means it reaches the advertised speed tire.



New/Existing Plan ID (examples)	67571 - for new customers only
Spectrum to be utilized on Price Plan	n77 + LTE
APN	V5GA01INTERNET
Max Up To Speed - DL	100Mbps
Max Up To Speed (Peak) - UL	10Mbps =>11Mbps
Customer disclosure - DL	50 - 85Mbps DL w/ speeds up to 100Mbps
Customer disclosure - UL	5-10Mbps
Customer disclosure - Latency (RTT)	30ms
Data Cap/ Threshold - DL / UL	unlimited

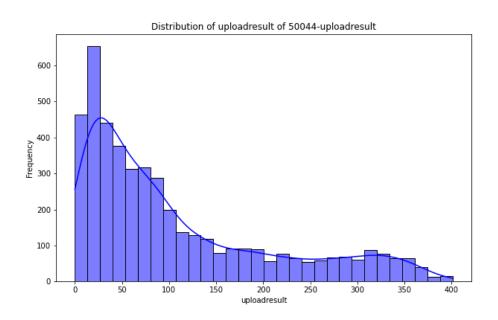
# 2. Features follows this method to transform feature to score





	mmWave - basic	mmWave - plus	mmWave - 5GHome (basic)	mmWave - 5GHome +
FWA			Price Plan 1	Price Plan 2
Launch Date	2022	2022	2023 (new)	2023 (new)
New/Existing Plan ID (examples)	50044 Consumer 50055 Employee	50116 Consumer 50117 Employee	50044 Consumer 50055 Employee	50116 Consumer 50117 Employee
Spectrum to be utilized on Price Plan	mmWave+LTE	mmWave + LTE	mmWave + LTE fallback	mmWave + LTE fallback
APN		V5GA01INTERNET	V5GA01INTERNET	V5GA01INTERNET

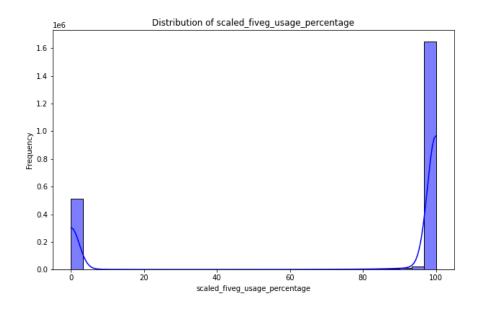
Max Up To Speed - DL	no cap	no cap	400Mbps	1.5Gbps
Max Up To Speed (Peak) - UL	no cap	no cap	20Mbps	75Mbps
Customer disclosure - DL	85-300Mbps	300-1000Mbps	85-300Mbps	300-1000Mbps
Customer disclosure - UL	typical 10Mbps	typical 50Mbps	10-20Mbps	25-75Mbps
Customer disclosure - Latency (RTT)	30ms	30ms	30ms	30ms

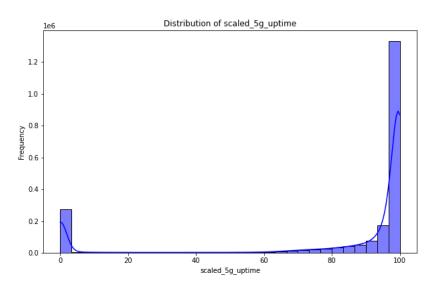


# Feature To FeatureScore with Special

## Case:

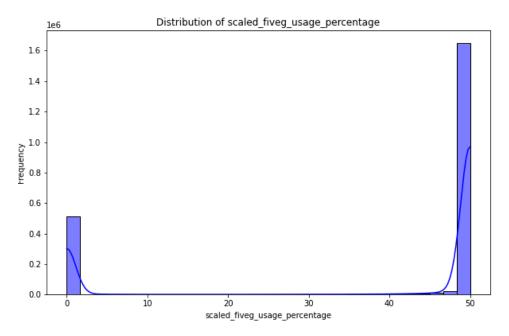
- 1. feature-(function)-->feature\_score
- 2. Function should be reasonable
- 3. The feature\_score should be consistent interpretable: below 50 is bad

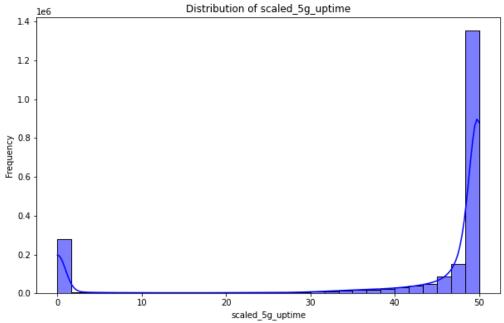




feature—(function)-->feature\_score, feature\_to\_score function should lead to consistent interpretation of score.

Case 1: Fiveg\_usage\_percentage, 5g\_uptime

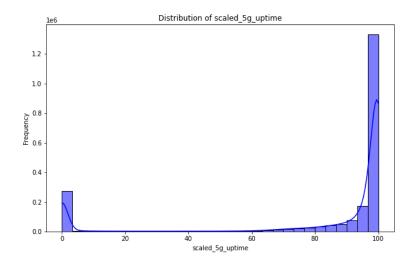


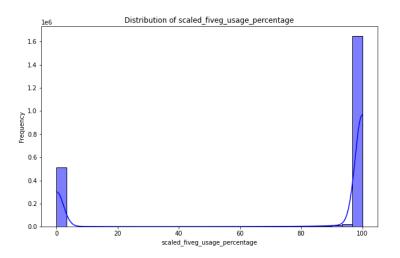


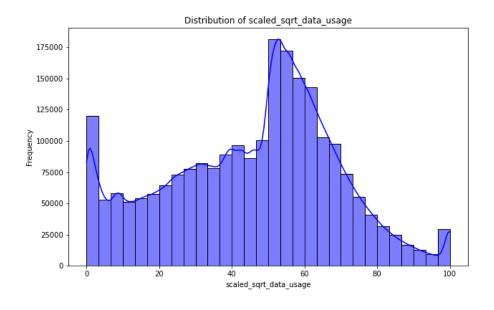
### benefit:

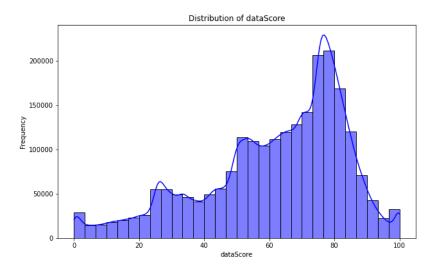
```
dataScore_weights = {
        "scaled_5g_uptime": 0.25,
        "scaled_fiveg_usage_percentage": 0.25,
        "scaled_sqrt_data_usage": 0.5,
    }
```

# If use 100, instead of 50



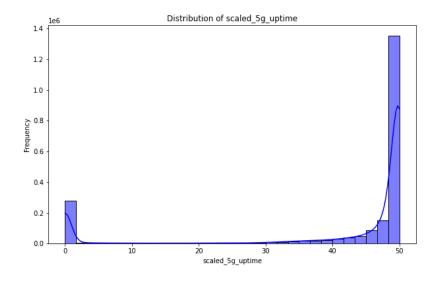


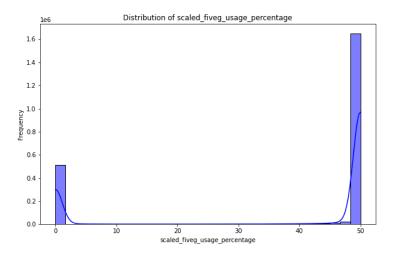


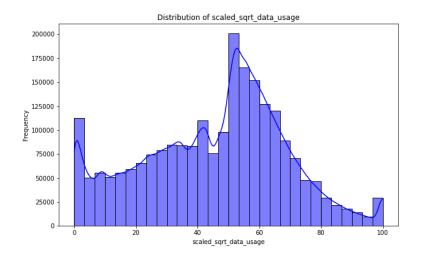


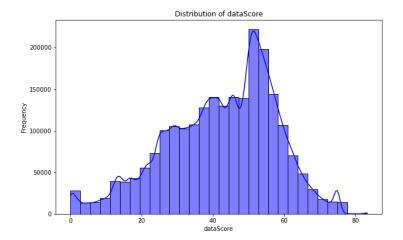
if you perform badly on data usage, not represented in category score, you may end up with 70.

If use 50







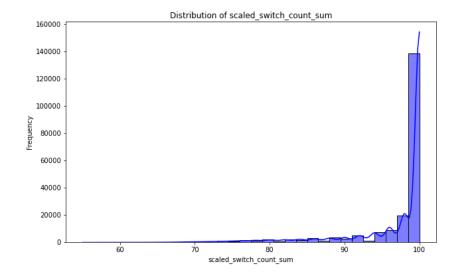


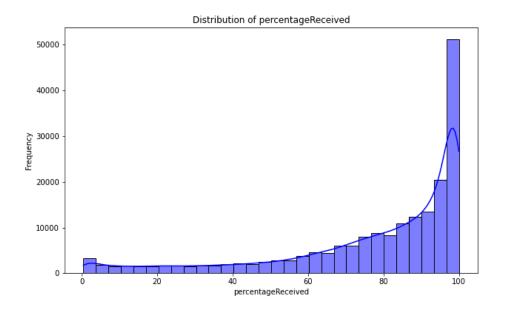
\*map [50,80] to [50,100]

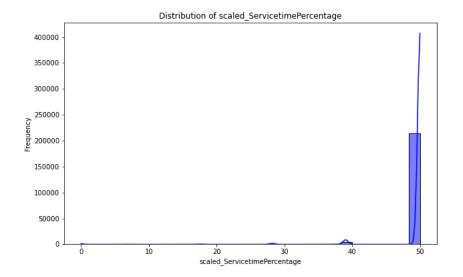
- 1. Focus on low score, if you perform badly, no matter which score, always represented in category score
- 2. Not overshadow other feature effect

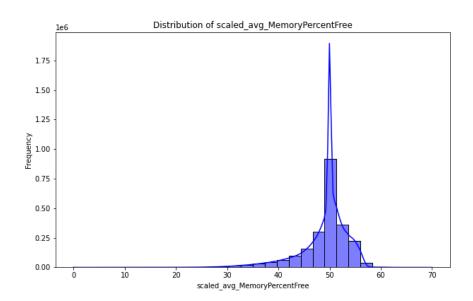
# Case 2: switch\_count\_sum, percentageReceived

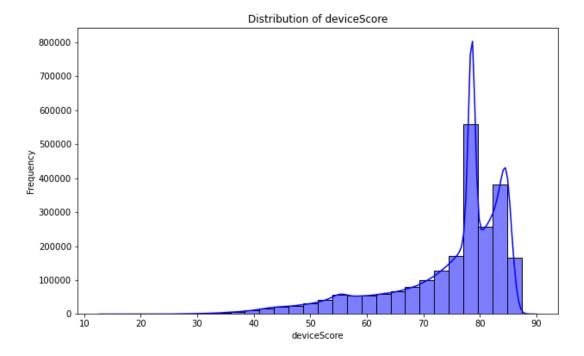
```
deviceScore_weights = {
         "scaled_switch_count_sum": 0.3,
         "scaled_percentageReceived":0.3,
         "scaled_reset_count":0.3,
         "avg_MemoryPercentFree":0.1
         }
```



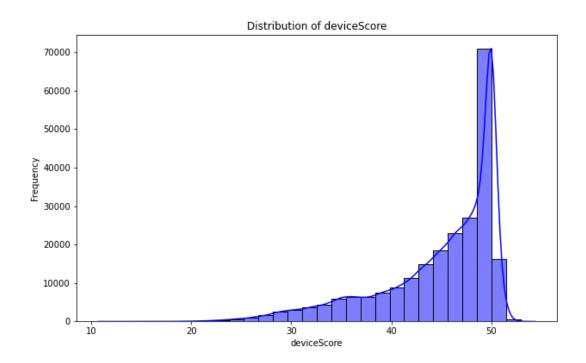




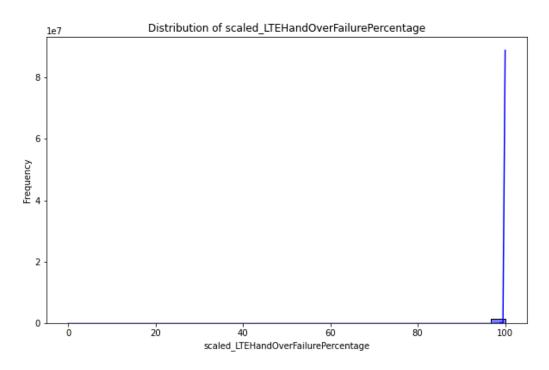




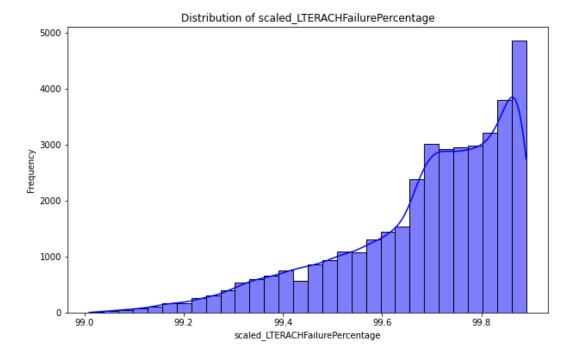
After switch [0,100] to [0,50]

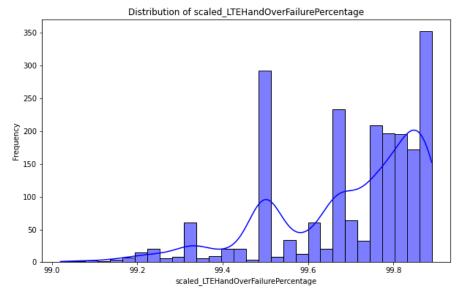


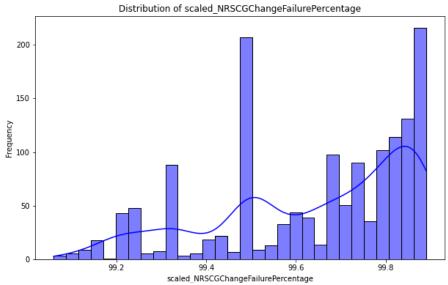
Case 3: LTERACHFailurePercentage, LTEHandOverFailurePercentage, NRSCGChangeFailurePercentage, reset\_count, ServicetimePercentage

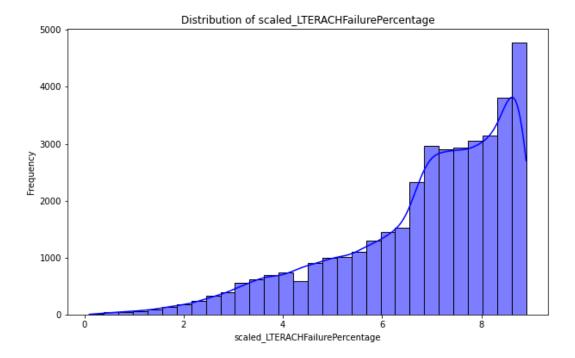


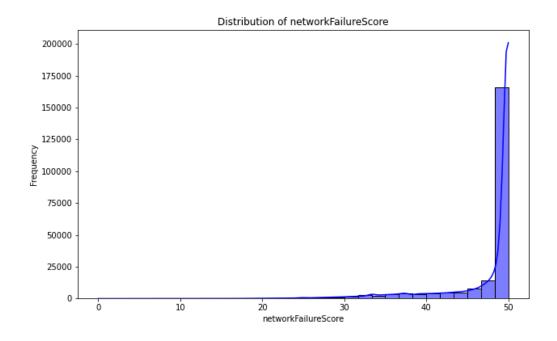
>99.9: 1782002 <99.9: 392541

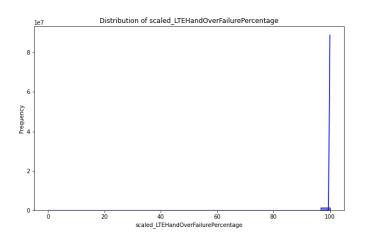




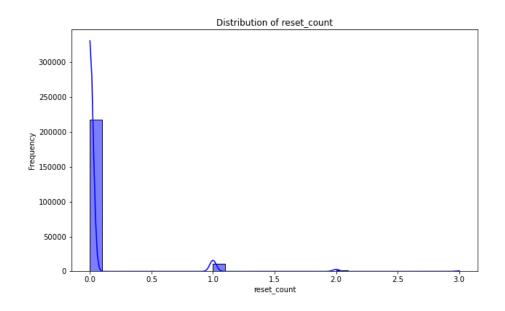


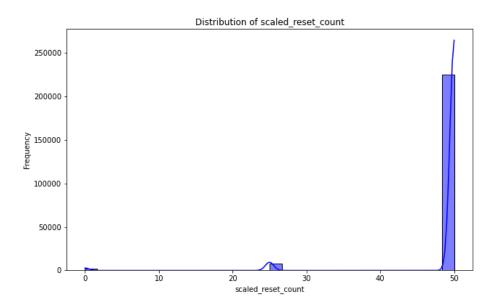






reset\_count

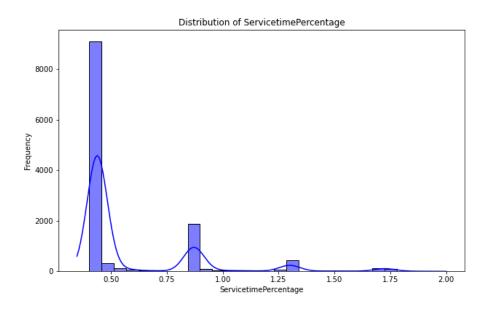




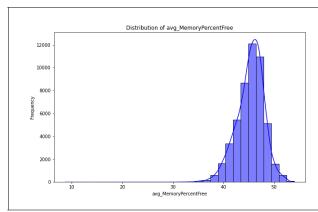
print( df_failure.filter( col("reset_count")==3 ).count() ) print( df_failure.filter( col("reset_count")==2 ).count() )	5576 19134
	1.0.0.

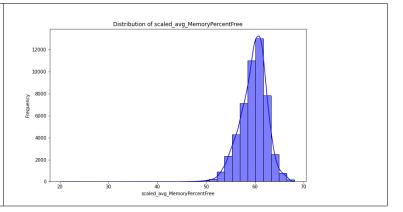
print( df_failure.filter( col("reset_count")==1 ).count() )	109142
print( df_failure.filter( col("reset_count")==0 ).count() )	2170636

ServicetimePercentage [0,2]->[50,0]

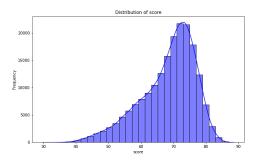


# Shift avg\_MemoryPercentFree



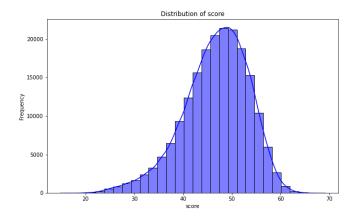


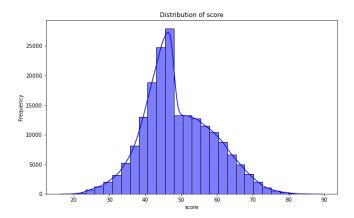
[0,100]

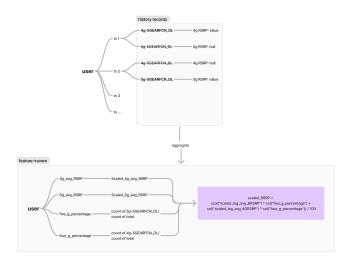


[0,50]: below 50ish is bad(below average), and is consistent over all feature\_score, categorical score, overall\_score

Drawback, Above 50, different interpretation







## Feature aggregation

1. Feature Score to Category Score

$$S_i = rac{\sum_{j=1}^{n_i} egin{cases} w_{ij} \cdot f_{ij} & ext{if } f_{ij} ext{ is not null} \ 0 & ext{if } f_{ij} ext{ is null} \ }{\sum_{j=1}^{n_i} egin{cases} w_{ij} & ext{if } f_{ij} ext{ is not null} \ 0 & ext{if } f_{ij} ext{ is null} \end{cases}$$

2. Category Score to 5g Home Score

$$T = rac{\sum_{i=1}^3 egin{cases} w_i \cdot S_i & ext{if } S_i ext{ is not null} \ 0 & ext{if } S_i ext{ is null} \ \end{pmatrix}}{\sum_{i=1}^3 egin{cases} w_i & ext{if } S_i ext{ is not null} \ 0 & ext{if } S_i ext{ is null} \end{cases}}$$

```
networkSpeedScore_weights = {
    "scaled_uploadresult": 0.2,
    "scaled_downloadresult": 0.2,
    "scaled_latency": 0.2
}
networkSignalScore_weights = {
    "scaled_log_avg_4GRSRP": 0.2,
    "scaled_log_avg_BRSRP": 0.2,
    "scaled_avg_CQI": 0.2,
    "scaled_log_avg_SNR": 0.2,
    "scaled_log_avg_5GSNR": 0.2,
    "scaled_log_avg_5GSNR": 0.2,
    "scaled_log_avg_5GSNR": 0.2,
    "scaled_log_avg_5GSNR": 0.2,
    "scaled_LTERACHFailurePercentage": 0.5,

"scaled_LTEHandOverFailurePercentage": 0.25,

"scaled_NRSCGChangeFailurePercentage": 0.25,
}
```

```
dataScore_weights = {
          "scaled_5g_uptime": 0.2,
          "scaled_fiveg_usage_percentage": 0.5,
          "scaled_sqrt_data_usage": 0.3,

}
deviceScore_weights = {
          "scaled_switch_count_sum": 0.25,
          "scaled_percentageReceived":0.25,
          "scaled_reset_count":0.25,
          "avg_MemoryPercentFree":0.25
        }
```

# Appendix:

	2024-04-25	2024-04-25	2024-04-25
cpe_model_name	BRSRP_median	BRSRP_lower_5_percentile	BRSRP_top_95_percentile
FSNO21VA	-101.07	-118.39	-68.89
ARC-XCI55AX	-100.76	-119.21	-70.55
ASK-NCQ1338FA	-100.2	-118.13	-71.02
WNC-CR200A	-99	-117.7	-69.66
tracfone	-102.74	-121.08	-71.38
NCQ1338E	-101.14	-119	-69.49
ASK-NCQ1338	-100.37	-119.82	-70.23
Others	-82.52339	-113.01	-49.563793
	2024-04-24 BRSRP_median	2024-04-24 BRSRP_lower_5_percentile	2024-04-24 BRSRP_top_95_percentile
FSNO21VA	-101.01	-118.4	-68.9
ARC-XCI55AX	-100.77	-119.19	-70.57

ASK-NCQ1338FA	-100.19	-118.08	-71
WNC-CR200A	-98.98	-117.68	-69.61
tracfone	-102.63	-121.21	-71.26
NCQ1338E	-101.11	-119	-69.26
ASK-NCQ1338	-100.38	-119.83	-70.17
Others	-82.57234	-113.12718	-49.492977
	2024-04-23 BRSRP_median	2024-04-23 BRSRP_lower_5_percentile	2024-04-23 BRSRP_top_95_percentile
FSNO21VA	-100.99	-118.4	-69
ARC-XCI55AX	-100.68	-119.12	-70.51
ASK-NCQ1338FA	-100.12	-118.03	-71
WNC-CR200A	-98.85	-117.58	-69.52
tracfone	-102.52	-121.13	-71.33
NCQ1338E	-101.086586	-119	-69.12
ASK-NCQ1338	-100.26	-119.76	-70.25
Others	-82.477	-112.95	-49.59368
	2024-04-22	2024-04-22	2024-04-22
	BRSRP_median	BRSRP_lower_5_percentile	BRSRP_top_95_percentile
FSNO21VA	-101	-118.3	-68.87
ARC-XCI55AX	-100.67	-119.06	-70.5
ASK-NCQ1338FA	-100.14	-118.02	-70.95
WNC-CR200A	-98.87	-117.58	-69.44
tracfone	-102.5	-121.24	-71.17
NCQ1338E	-101.06	-119	-69.32
ASK-NCQ1338	-100.25	-119.64	-70.14

Others	-82.636696	-113.03008	-49.623066
	2024-04-21 BRSRP median	2024-04-21 BRSRP lower 5 percentile	2024-04-21 BRSRP top 95 percentile
FSNO21VA	-101.06	-118.38	
ARC-XCI55AX	-100.76	-119.12	-70.43
ASK-NCQ1338FA	-100.21	-118.05	-70.94
WNC-CR200A	-98.93	-117.71	-69.46
tracfone	-102.6	-121.44	-71.58
NCQ1338E	-101	-119	-69.31
ASK-NCQ1338	-100.21	-119.63	-70
Others	-82.48329	-113	-49.7276
	2024-04-20 BRSRP_median	2024-04-20 BRSRP_lower_5_percentile	2024-04-20 BRSRP_top_95_percentile
FSNO21VA	-101.07	-118.28	-68.85
ARC-XCI55AX	-100.72	-119.03	-70.42
ASK-NCQ1338FA	-100.16	-118.02	-70.97
WNC-CR200A	-98.88	-117.58	-69.52
tracfone	-102.52	-121.31	-71.18
NCQ1338E	-101.1	-119	-69.46
ASK-NCQ1338	-100.24	-119.71	-70.1
Others	-82.444565	-112.84	-49.721775

# Covariance:

