

# SDR Input Power Estimation Algorithms

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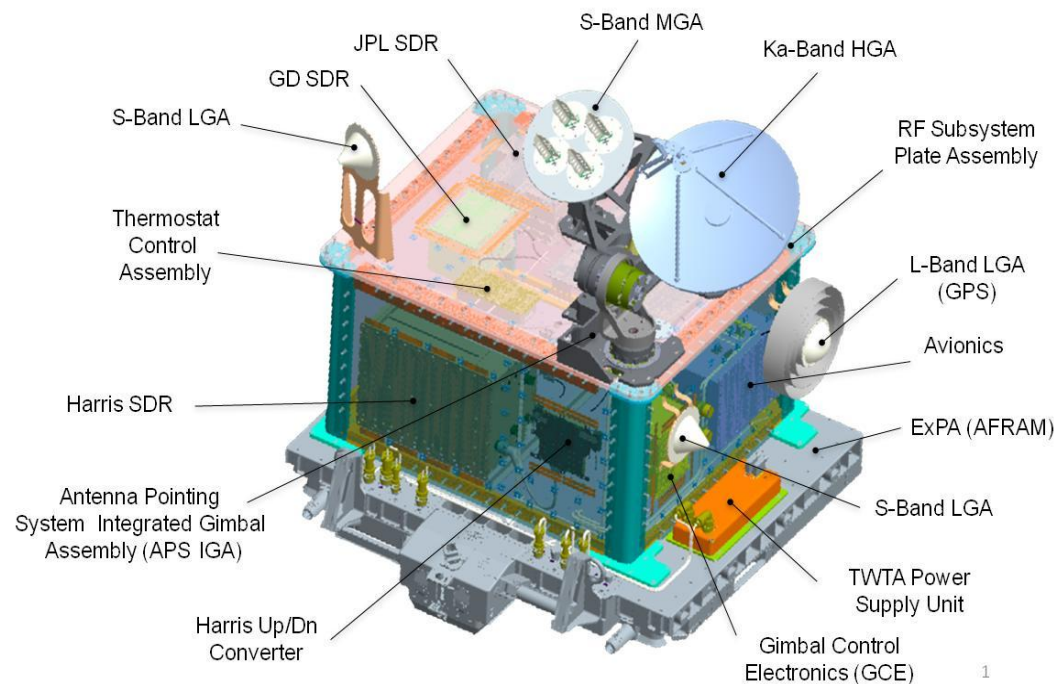
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# BACKGROUND INFORMATION

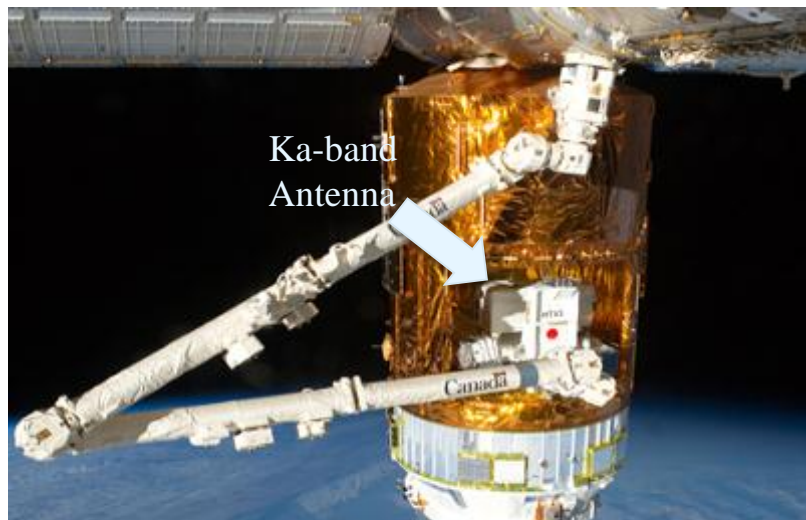
# Space Communication and Navigation (SCaN) Testbed Flight System Overview

- 2 S-band SDRs
- 1 Ka-band SDR
- Ka-band TWTA
- S-band switch network
- Antennas
  - 2 - low gain S-band antennas
  - 1 - L-band GPS antenna
  - Medium gain S-band and Ka-band antenna on antenna pointing subsystem.
- Antenna pointing system
- Flight Computer/Avionics



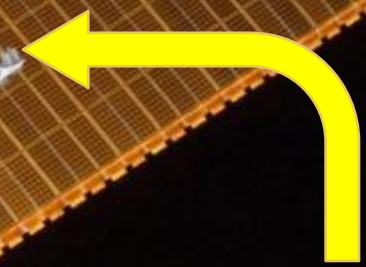
- Launched on Japanese HTV-3 on July 20, 2012
- Installed on ISS August 7, 2012
- Checkout and Commissioning is in progress

# Pictures of Installation and First Operations



Radiator

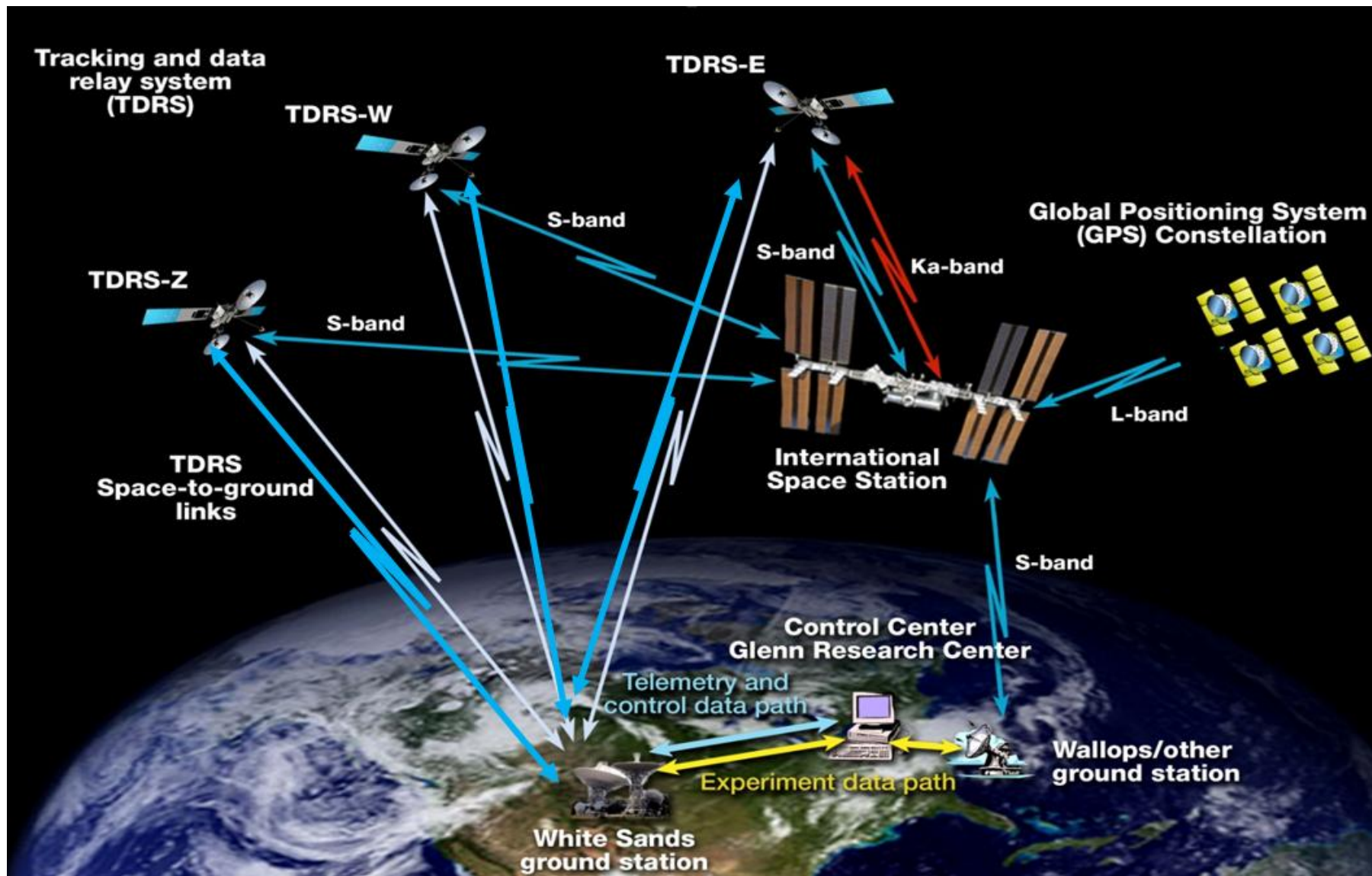
Solar Array



**SCaN Testbed aboard  
International Space Station**

Truss

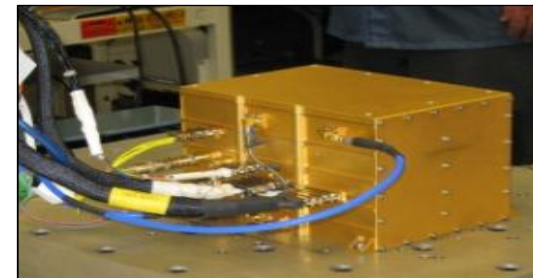
# SCaN Testbed Experiment System





# SCaN Testbed General Dynamics SDR Description

- TDRSS S-band Transponder
  - 8 receive waveform configurations
  - 30 transmit waveform configurations
- 1 Xilinx Virtex II QPro FPGA, 3 M gate
- ColdFire microprocessor
- Analog and Digital automatic gain controls (AGCs)



Waveform Number	Center Frequency (GHz)	Data Rate (kbps)	Forward Error Correction
1	SA	18	Coded
2	SA	18	Uncoded
3	SA	72	Coded
4	SA	72	Uncoded
5	MA	18	Coded
6	MA	18	Uncoded
7	MA	72	Coded
8	MA	72	Uncoded

- TDRSS: Tracking Relay Data Satellite System
- SA: Single Access (2.041 GHz)
- MA: Multiple Access (2.106 GHz)





# SDR Input Power Estimators Description

## Motivation

- The received power can be used to characterize and estimate link performance
- The estimated link performance can be used to update predicted performance calculated from link budgets
- GD SDR did not implement an SDR input power estimator

## Expected On-orbit Operating Conditions

- SDR Input Power Range: -130 dBm to -100 dBm
- Temperature: -15 °C to +45 °C

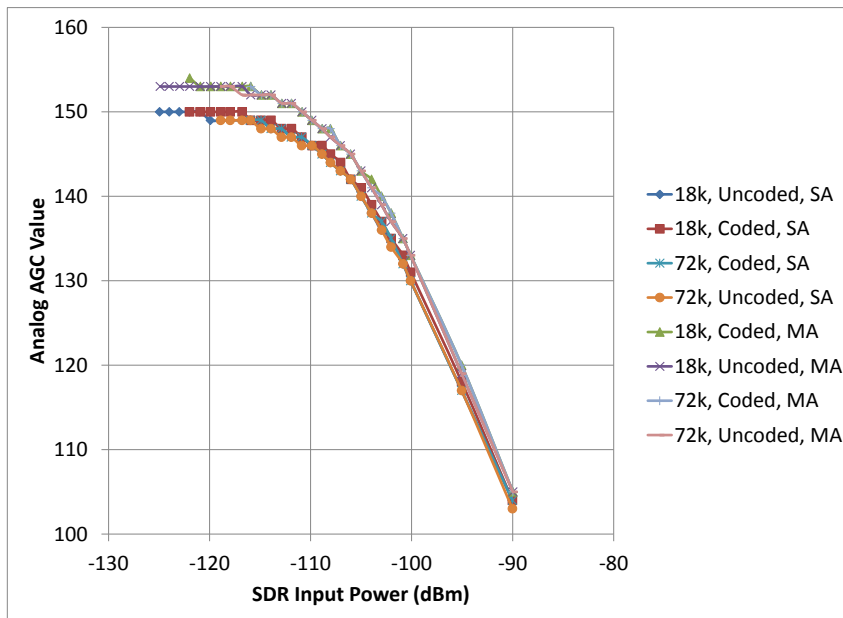
## Estimator Method

- Utilize digital and analog AGCs and baseplate temperature to estimate SDR input power

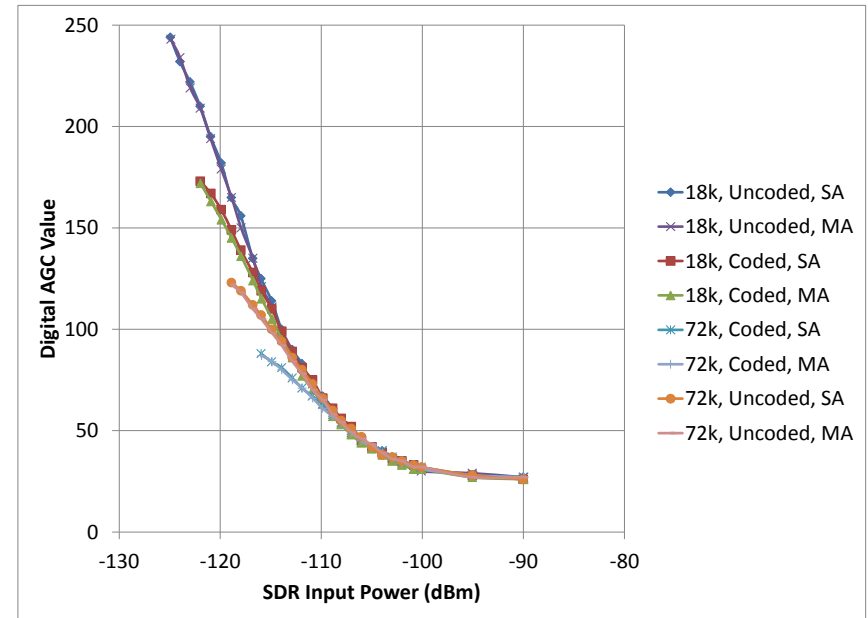


# AGC Characterization Results at Ambient Temperature

## Analog AGC at 26 °C



## Digital AGC at 26 °C

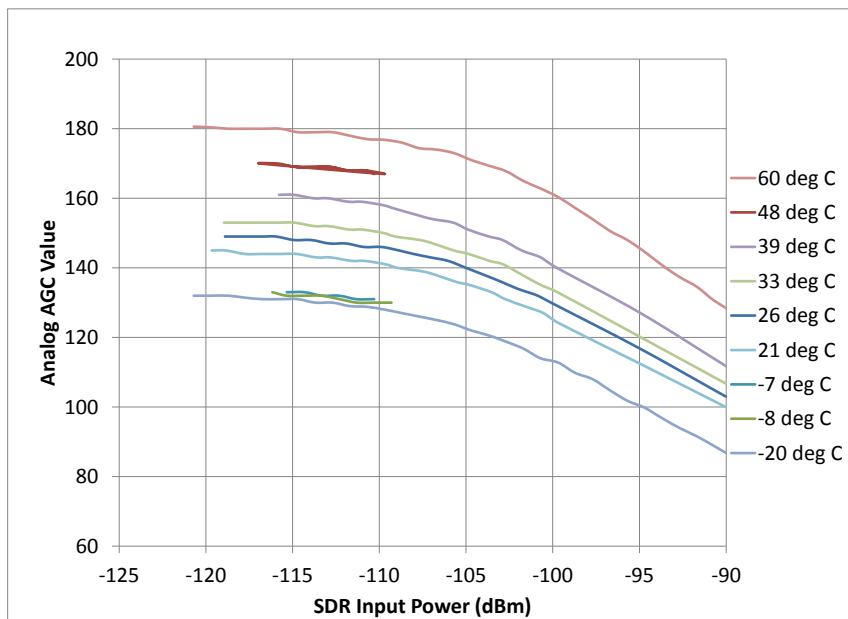


- Analog AGC varies with center frequency (MA/SA)
- Digital AGC varies with symbol rate (coding + data rate)

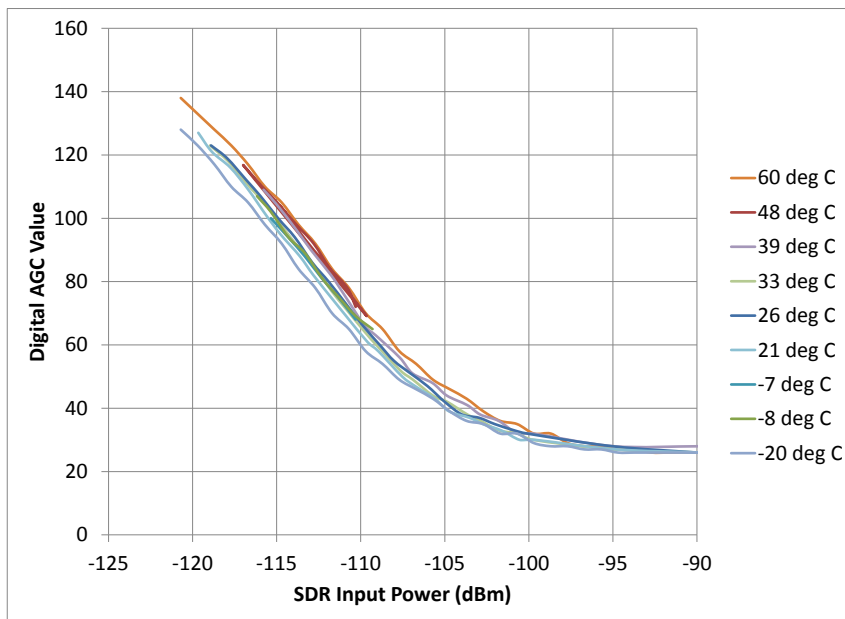


# AGC Characterization Results over Temperature

## Analog AGC



## Digital AGC



- Both analog and digital AGCs vary over temperature. The analog AGC variation is more significant.

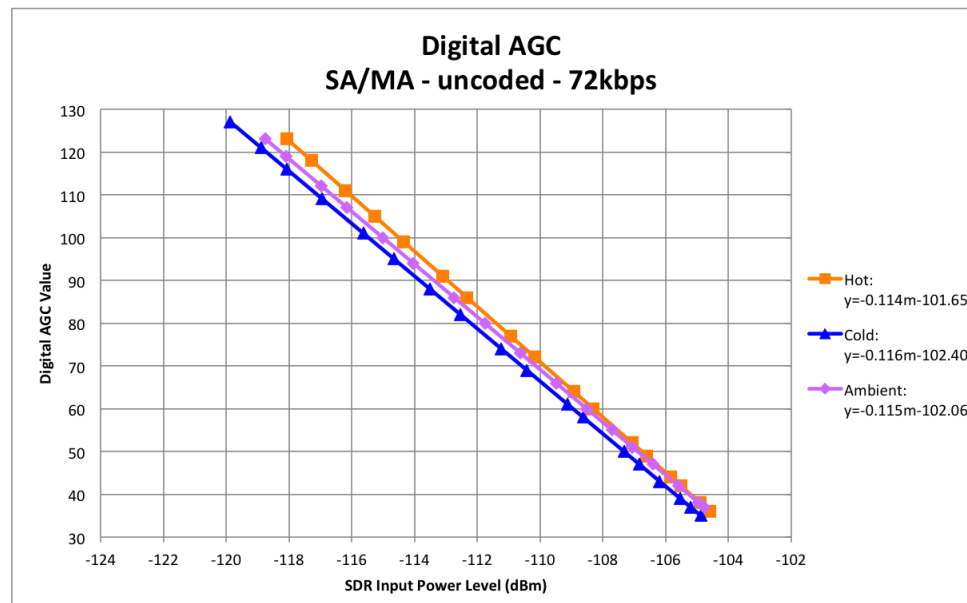


# SDR INPUT POWER ESTIMATOR DESCRIPTIONS



# Straight Line Estimator Algorithm Description

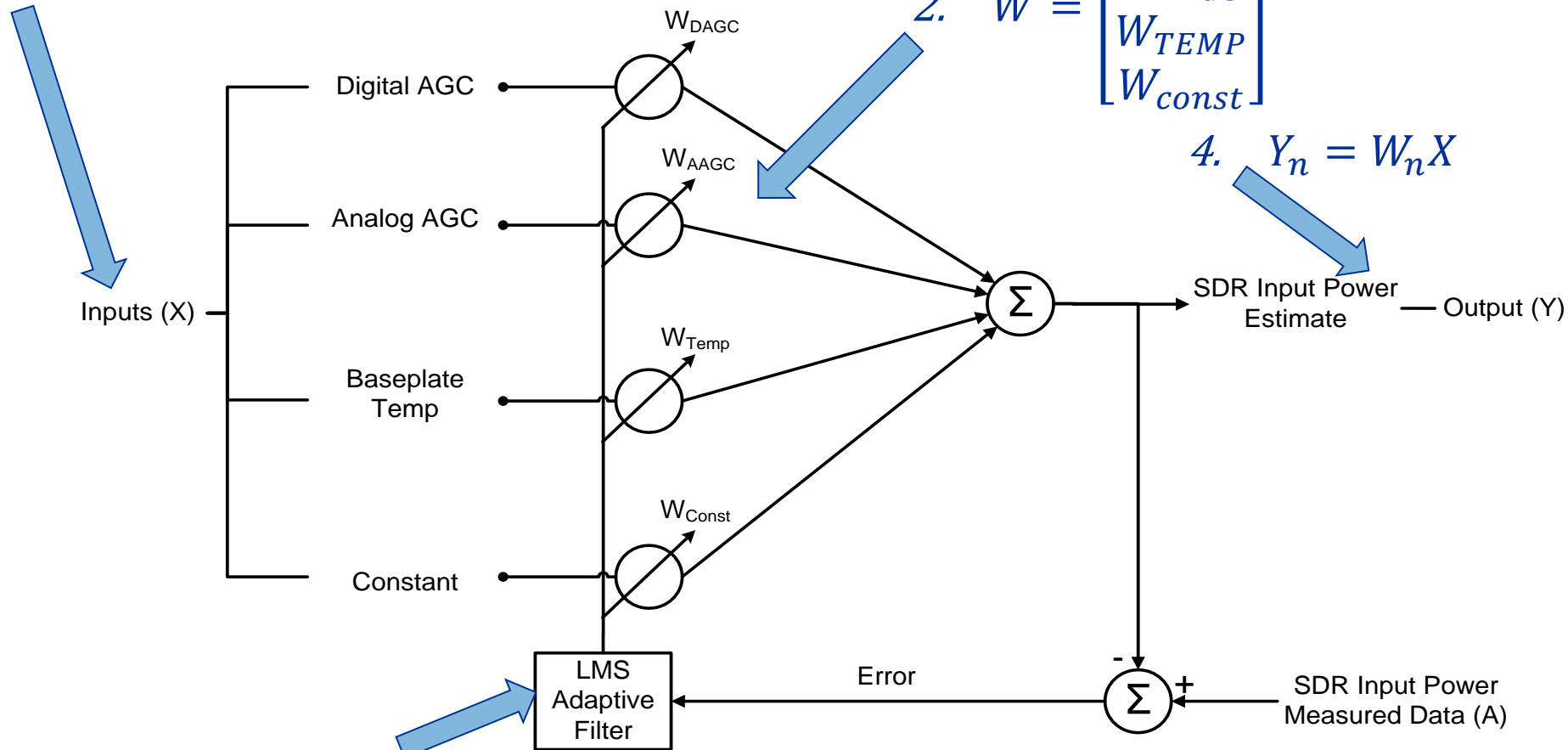
- Straight line equations created to estimate power based on linear region of digital AGC
- 3 equations created for each waveform in 3 temperature regions:
  - Cold:  $<10\text{ }^{\circ}\text{C}$
  - Ambient:  $10\text{ }^{\circ}\text{C} - 35\text{ }^{\circ}\text{C}$
  - Hot:  $>35\text{ }^{\circ}\text{C}$
- SDR input power range limited to linear region of the digital AGC





# Adaptive Linear Combiner Estimator Block Diagram

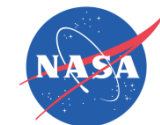
1.  $X = [DAGC \ AAGC \ Temp \ 50]$





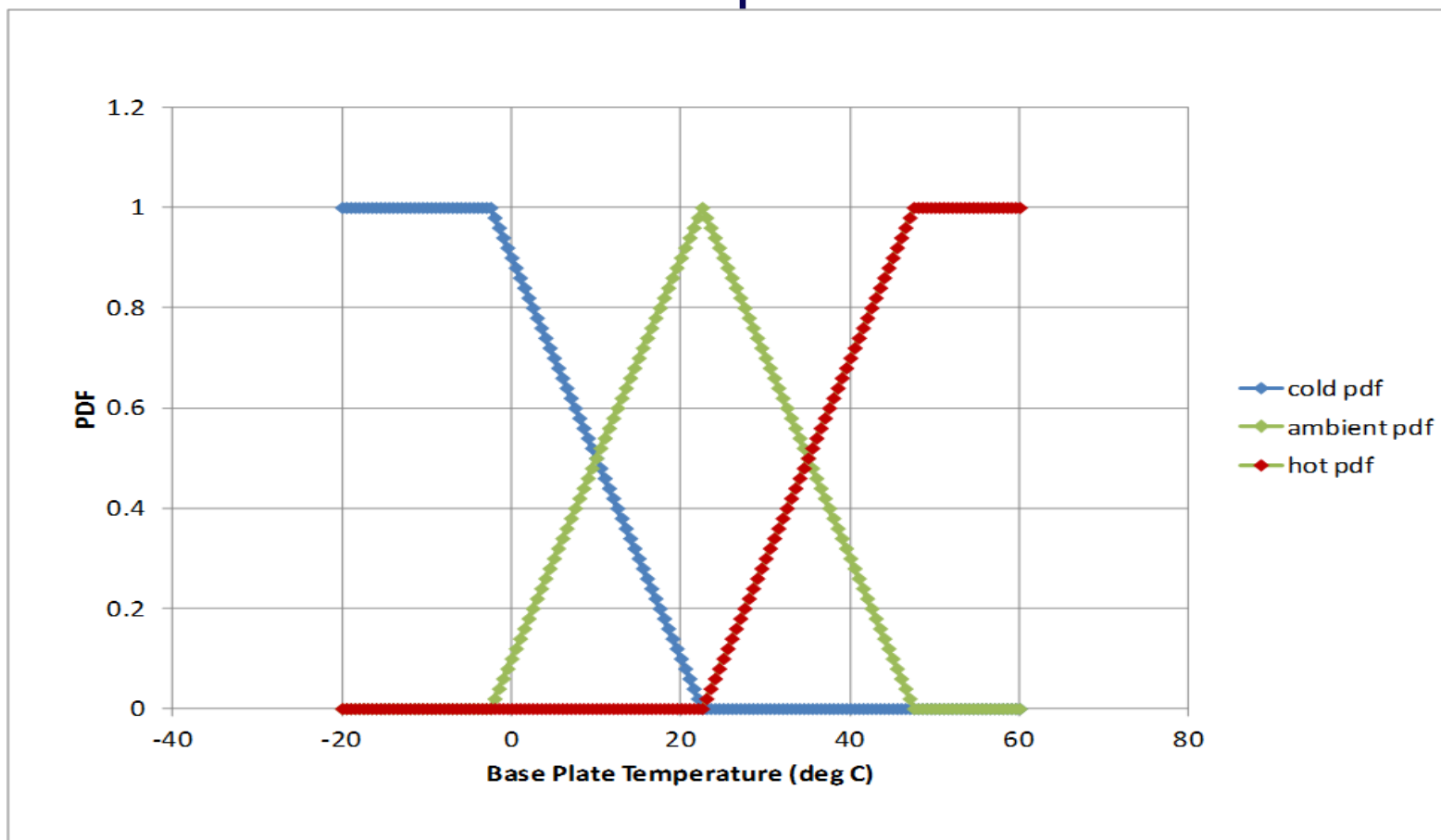
# Adaptive Linear Combiner Estimator Training Algorithm Description

- Input the training data set
- Sort the data into 3 temperature bins
  - Cold:  $<10\text{ }^{\circ}\text{C}$
  - Ambient:  $10\text{ }^{\circ}\text{C} - 35\text{ }^{\circ}\text{C}$
  - Hot:  $>35\text{ }^{\circ}\text{C}$
- Randomize the data in each bin
- Initialize the weight vector,  $W$
- Compute the weight vector for each temperature bin
- Repeat the previous step until the weight vector converges
- Calculate the estimated output power



# Adaptive Linear Combiner Estimator

## Membership Functions



- SDR input power is a function of 2 temperature bins. For example, at 17.5 °C:

$$Y = .2W_c X + .8W_a X + 0W_h X$$





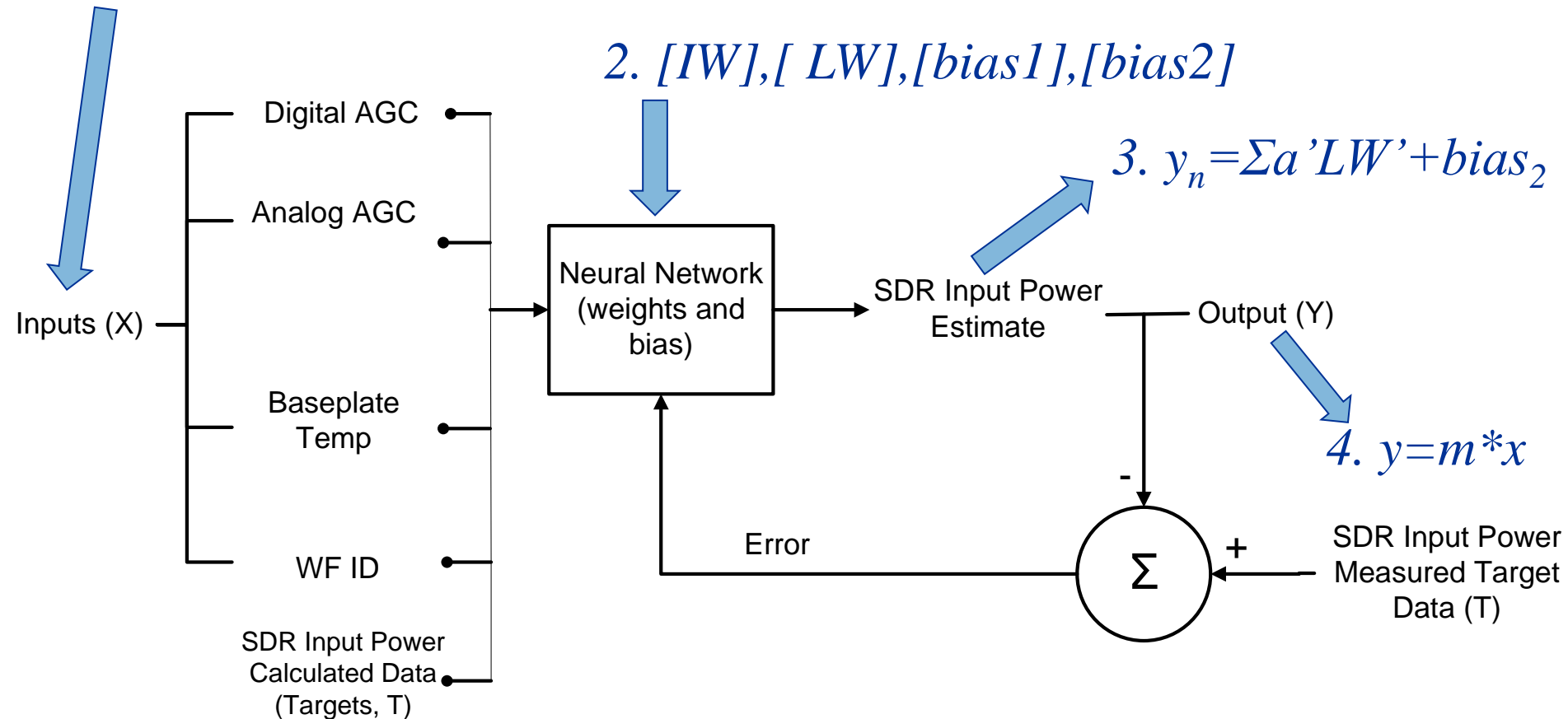
# Neural Network Estimator Block Diagram

1.  $X = [DAGC \ AAGC \ Temp \ WFID \ T]$

2.  $[IW], [LW], [bias1], [bias2]$

3.  $y_n = \sum a' LW' + bias_2$

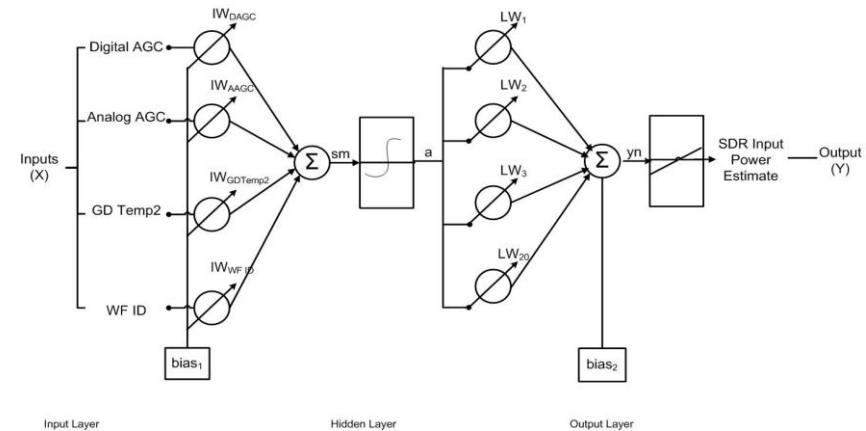
4.  $y = m * x$





# Neural Network Estimator Algorithm Description

- Input the training data set
- Train neural network (60% data used for training)
- Simulate neural network (20% data used for validation)
- Obtain weights and bias
- Compare the output ( $Y$ ) to SDR input power measured target data,  $T$ .
- Analyze the error; train and simulate the neural network to obtain new weights and bias if necessary.

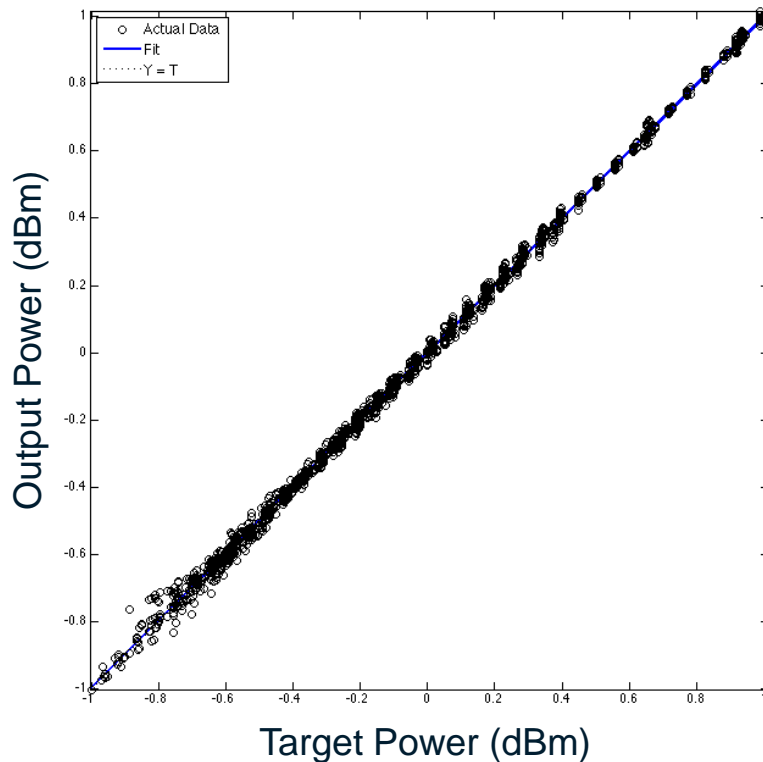




# Neural Network Estimator Regression Analysis

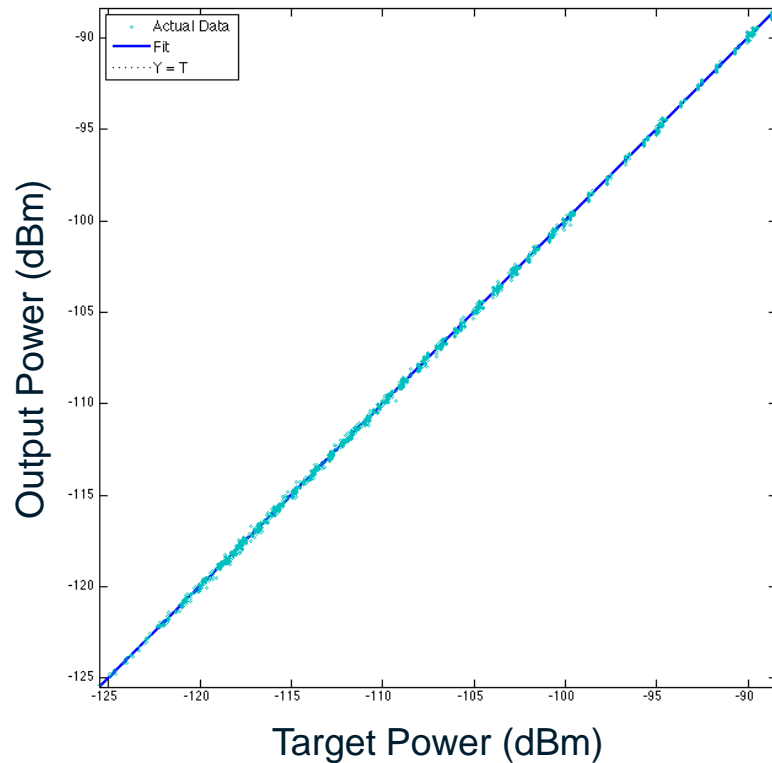
## Training

### Regression Plot



## Final

### Regression Plot



The training process is repeated until there is a good fit between the target and estimated power.



# ESTIMATOR ERROR ANALYSIS

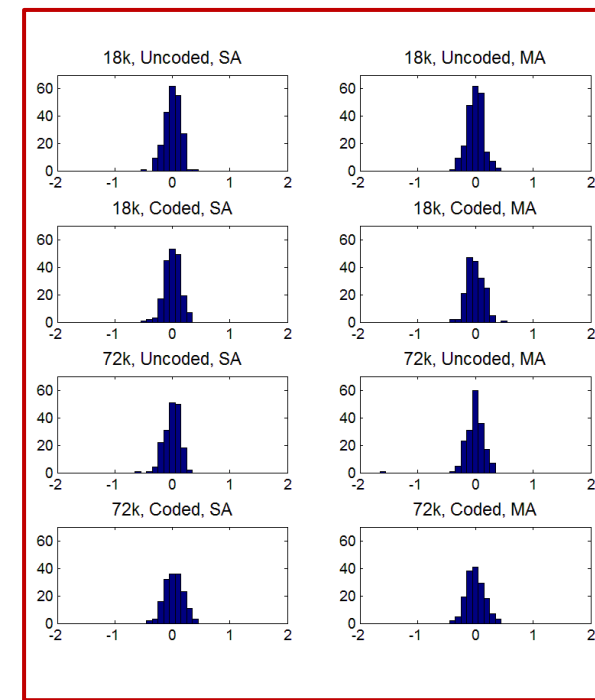
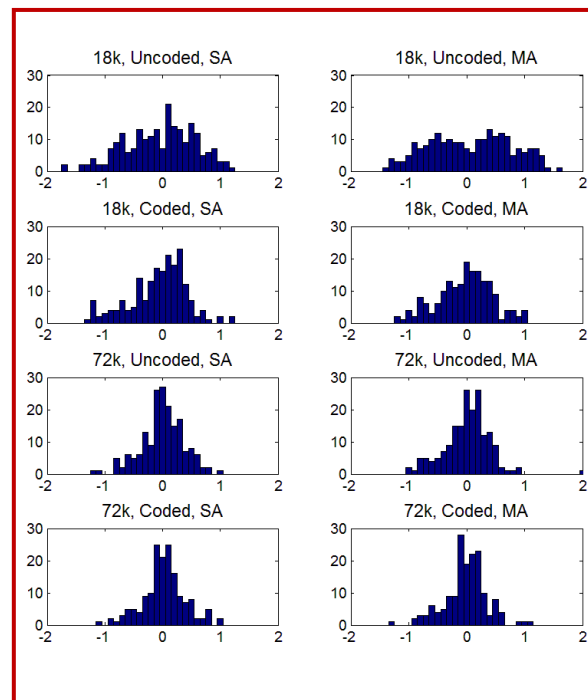
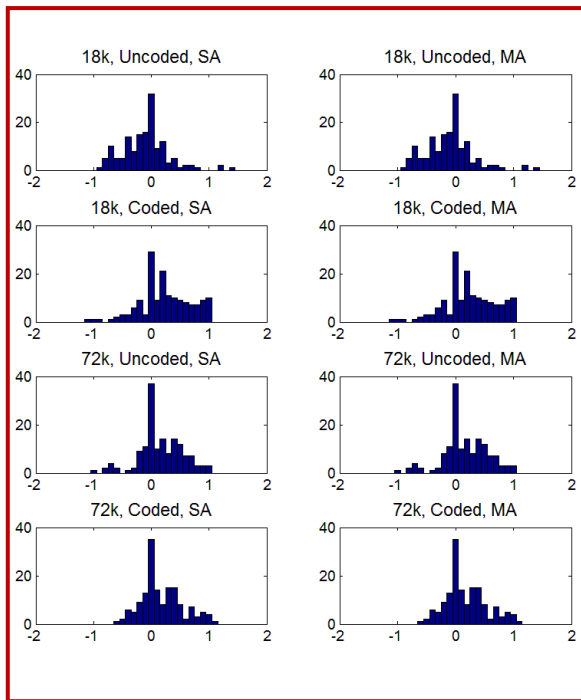


# Histogram Error Analysis

## Straight Line

## Linear Adaptive

## Neural Network

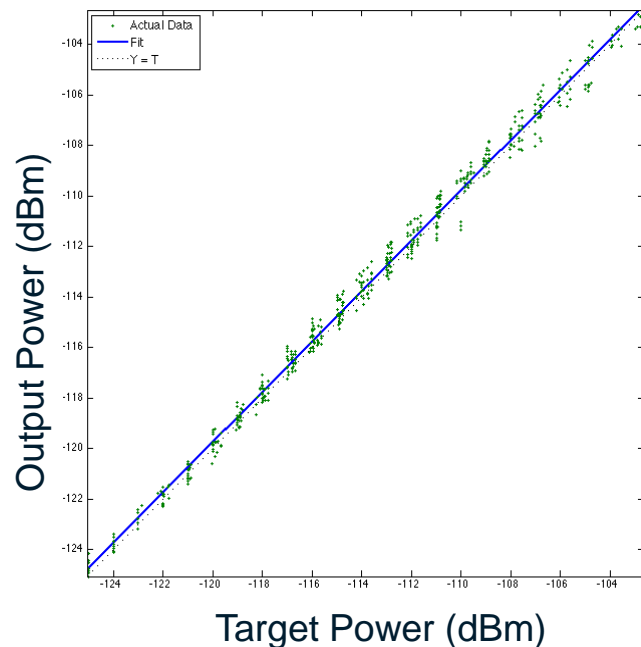


The histograms show that the neural network estimator has the lowest error ( $\pm 0.5$  dB), while the straight line and linear adaptive estimators are about the same ( $\pm 1.0$  dB).

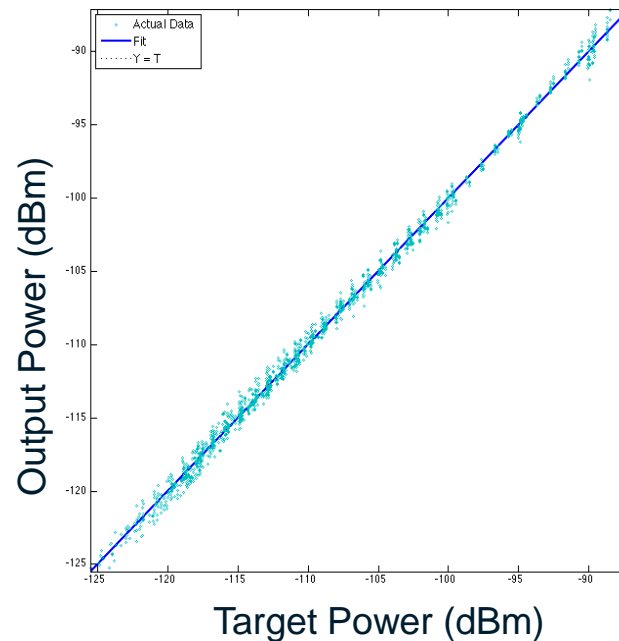


# Regression Error Analysis

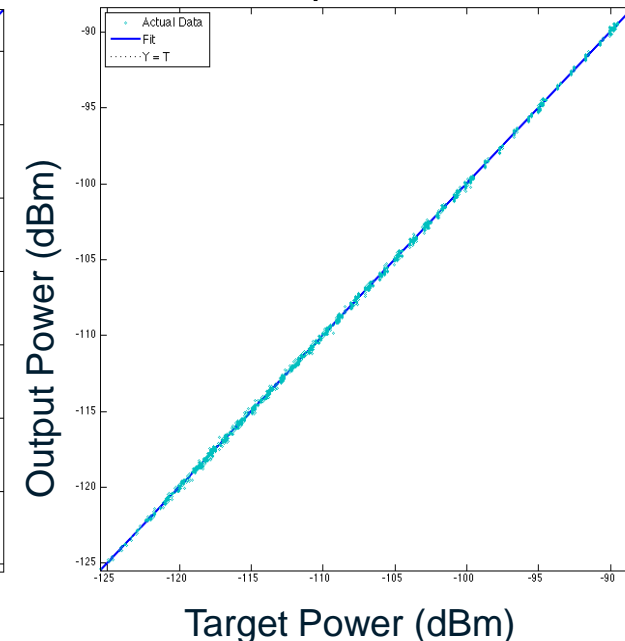
## Straight Line



## Linear Adaptive



## Neural Network



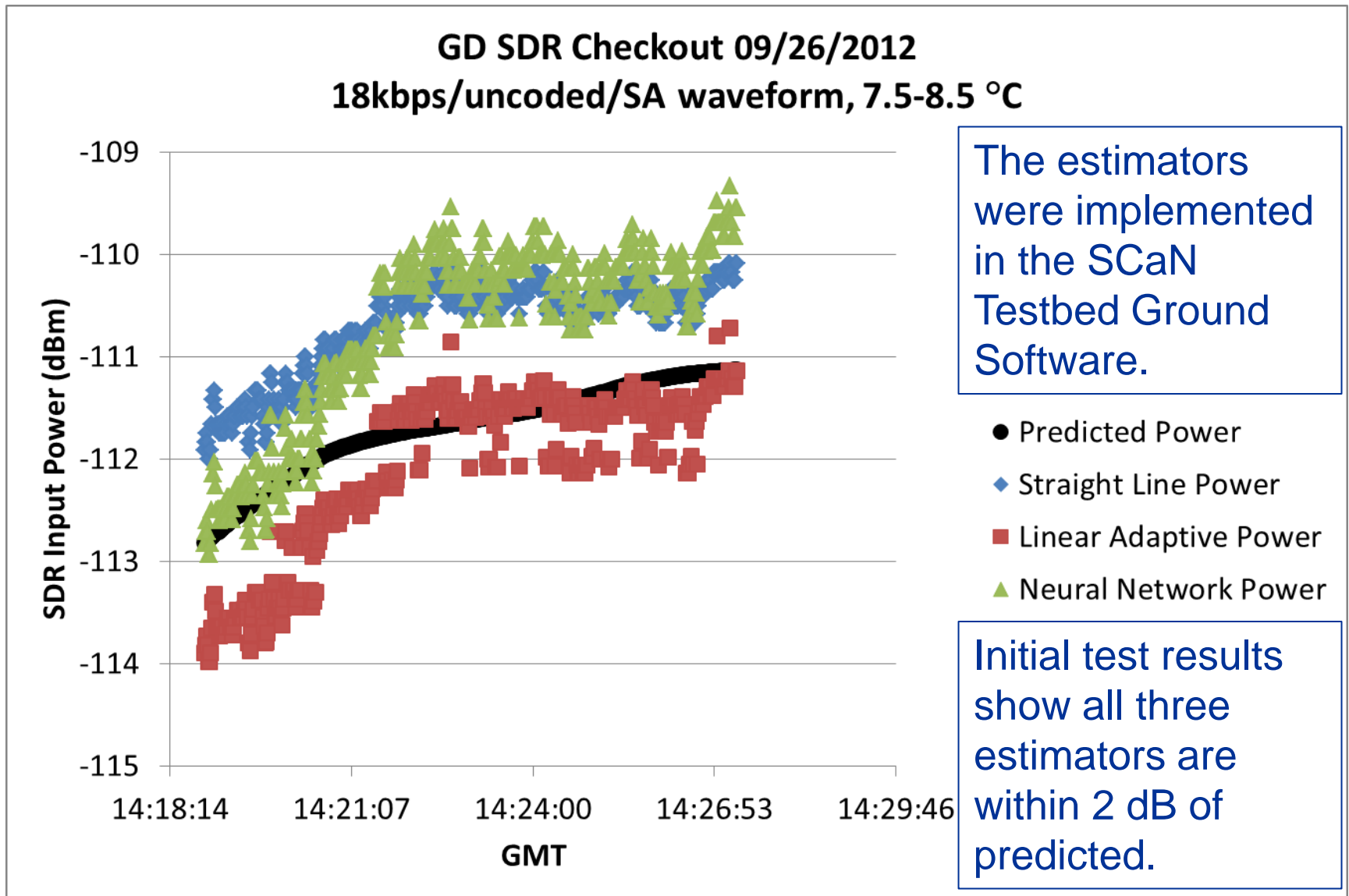
The straight line estimator and linear adaptive estimator have about the same error, but the linear adaptive has a higher SDR input power level (-90 dBm).



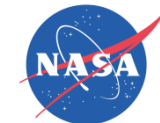
# ON-ORBIT TESTING EXPERIMENTAL RESULTS



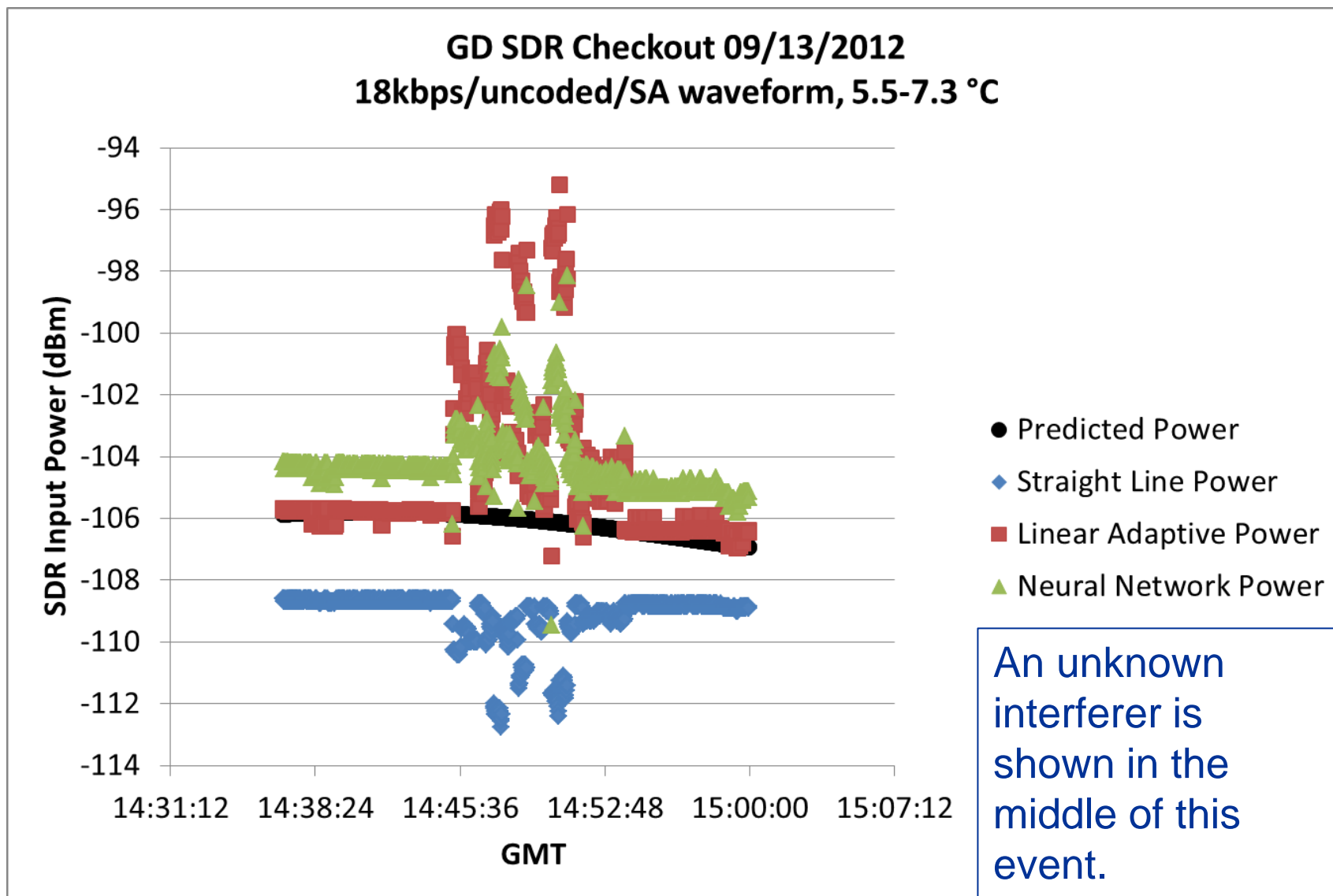
# On-orbit Testing Experimental Results







# On-orbit Testing Experimental Results





## Summary / Future Work

### Summary

- 3 estimators have been implemented and tested on the ground
- Initial on-orbit tests indicate that the estimators are within 2 dB of predicted SDR input power
- Algorithm dependence on the AGCs can lead to invalid results in the presence of interfering signals

### Future Work

- Continue to characterize the SDR input power algorithms during on-orbit operations on ISS
- Utilize the engineering model (EM) characterization data to create SDR input power estimators for the EM
- A method for extending these algorithms for future waveforms could be developed



# Questions?

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