

319-UW659

# Adaptive NFC WPT System Implementing Neural Network-Based Impedance Matching with Bypass Functionality

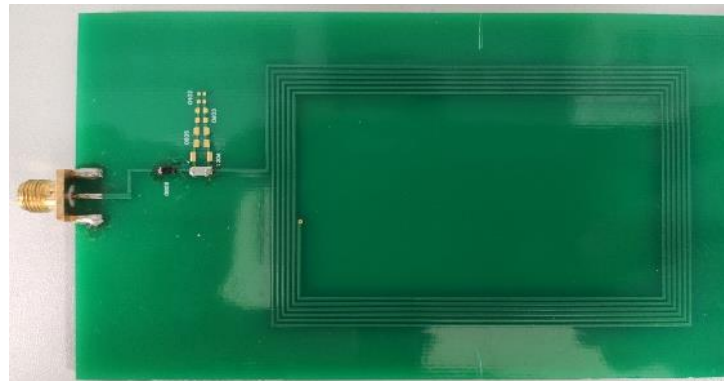
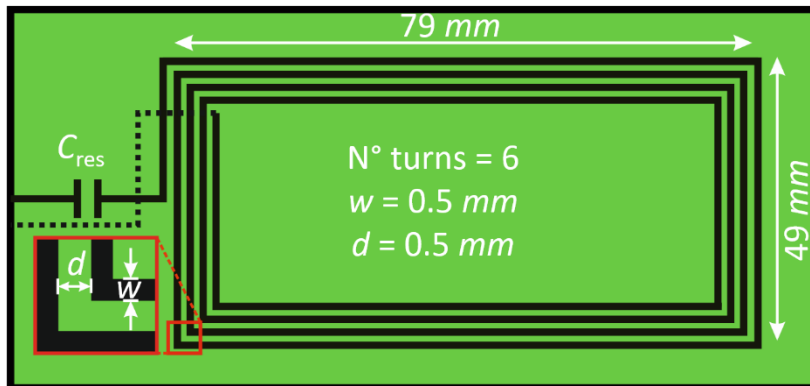
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Pommerenke<sup>1,2</sup>, B. Auinger<sup>2</sup>, and J. Grosinger<sup>1</sup>

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- Introduction
- Structure
- Components
  - Transmitter-Receiver Coils
  - Adaptive Matching Network
  - Artificial Neural Network
- System performance
- Conclusion

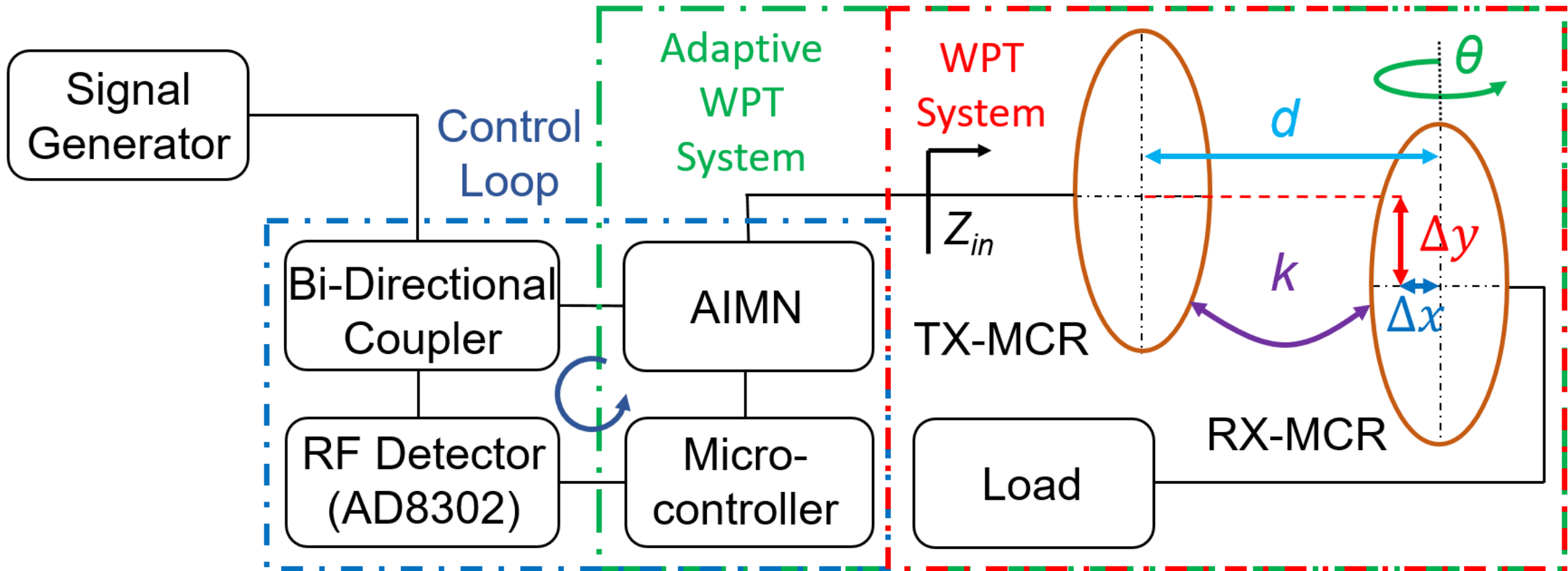
- WPT system based on MCR at ISM band - 13.56 MHz
  - Explore NFC charging capabilities
  - Real-time optimization under varying TX-RX positions
  - Performance of ISO/ICE 14443 class 1 coils for WPT
  - Analyze advantages and disadvantages of AIMNs
  - Provide an AI enhanced solution of an RF adaptive WPT system



WPT: Wireless power transfer system  
MCR: Magnetically coupled resonators  
TX: Transmitter  
RX: Receiver  
AIMN: Adaptive impedance matching network  
AI: Artificial intelligence  
RF: Radio-Frequency  
NFC: Near-field communications  
ISM: Industrial, scientific, medical

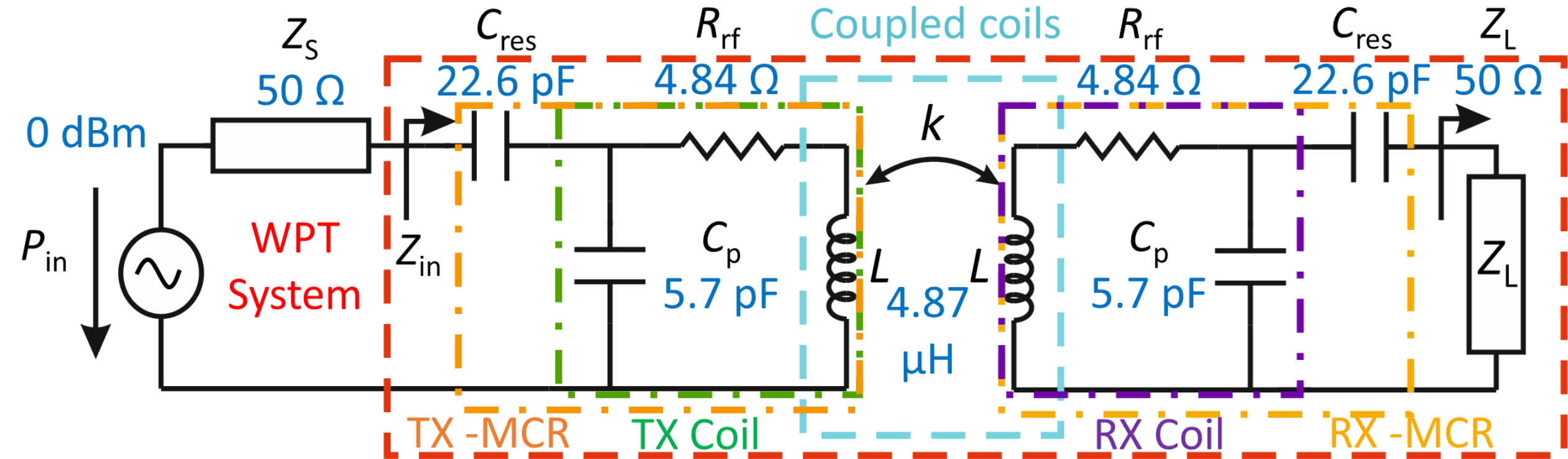
## Structure of the real-time adaptive WPT system

$d$ : Inter-coil distance  
 $\theta$ : Azimuthal tilt  
 $\Delta x$ : Horizontal misalignment  
 $\Delta y$ : Vertical misalignment  
 $Z_{in}$ : Input impedance



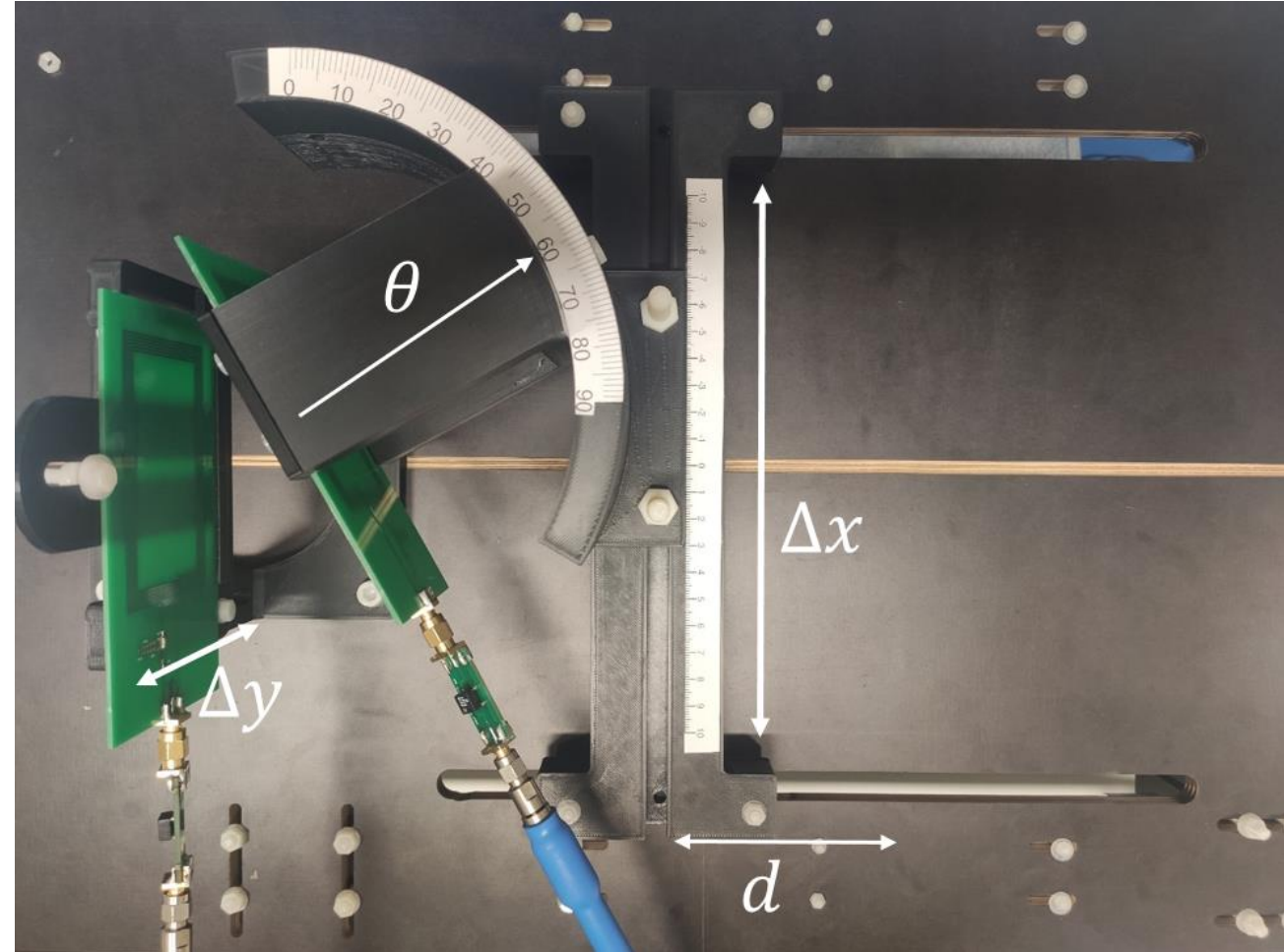
# TX-RX Coils

- MCR TX-RX: Series-series (SS) resonant configuration



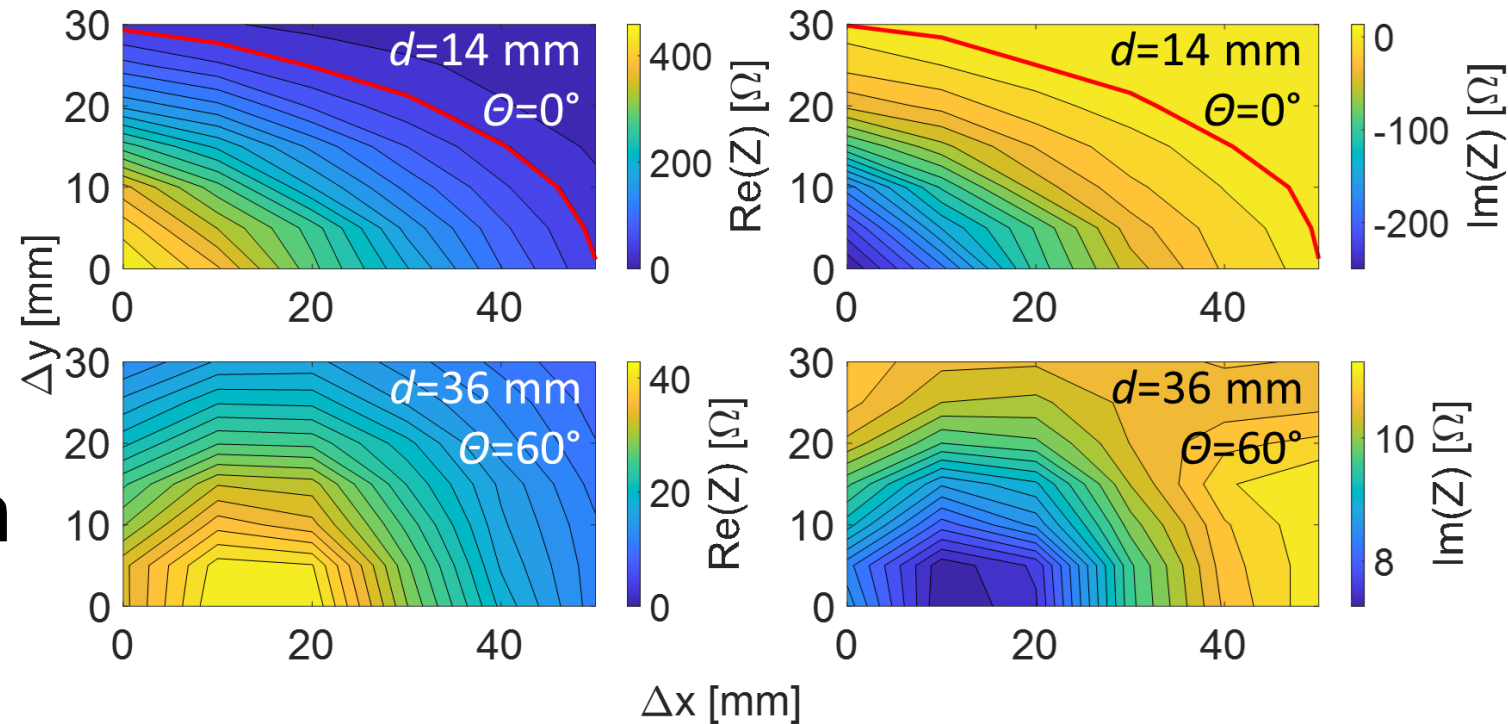
# Measurement Setup

- WPT channel characterized under different TX-RX positions
- Semi-automatized process
- Scattering-parameters measured with a VNA
- Large dataset assembled
- DOI:10.21227/vtp8-x586



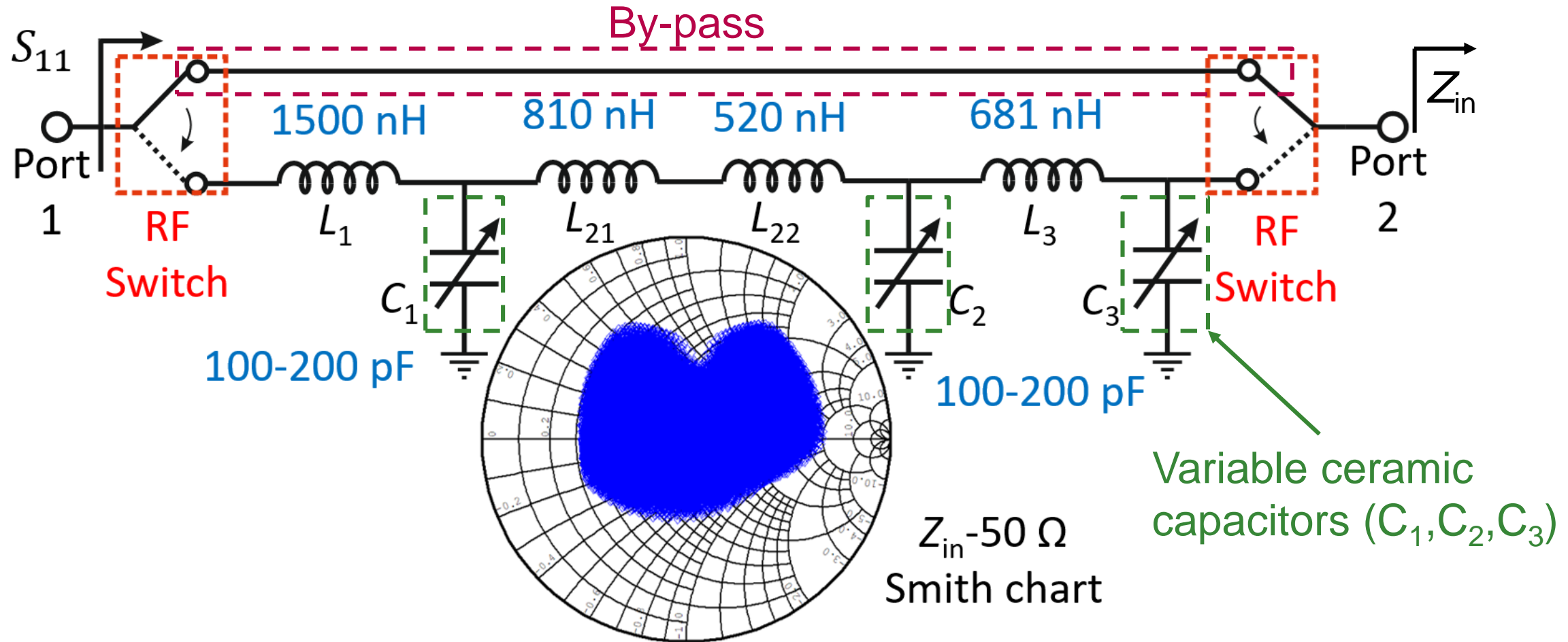


- Different coupling regimes determined by  $Z_{in}$ 
  - Overcoupling
  - Undercoupling
  - Critical coupling
- Red trace indicates critical coupling region



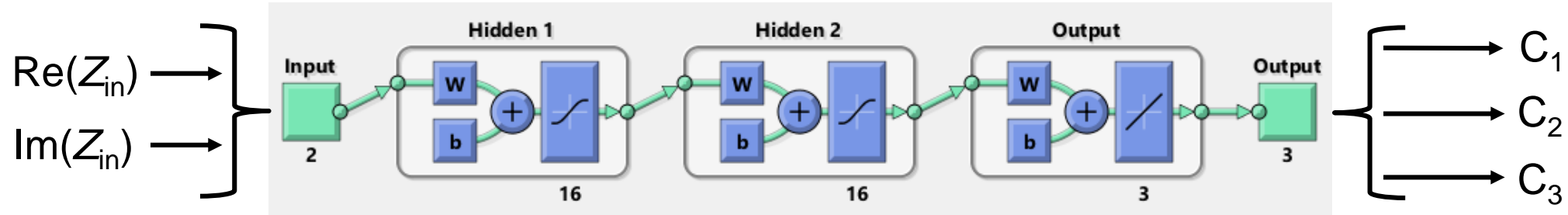
# Adaptive Matching Network

- AMN designed to perform matching of  $Z_{in}$  to  $50\ \Omega$  at 13.56 MHz



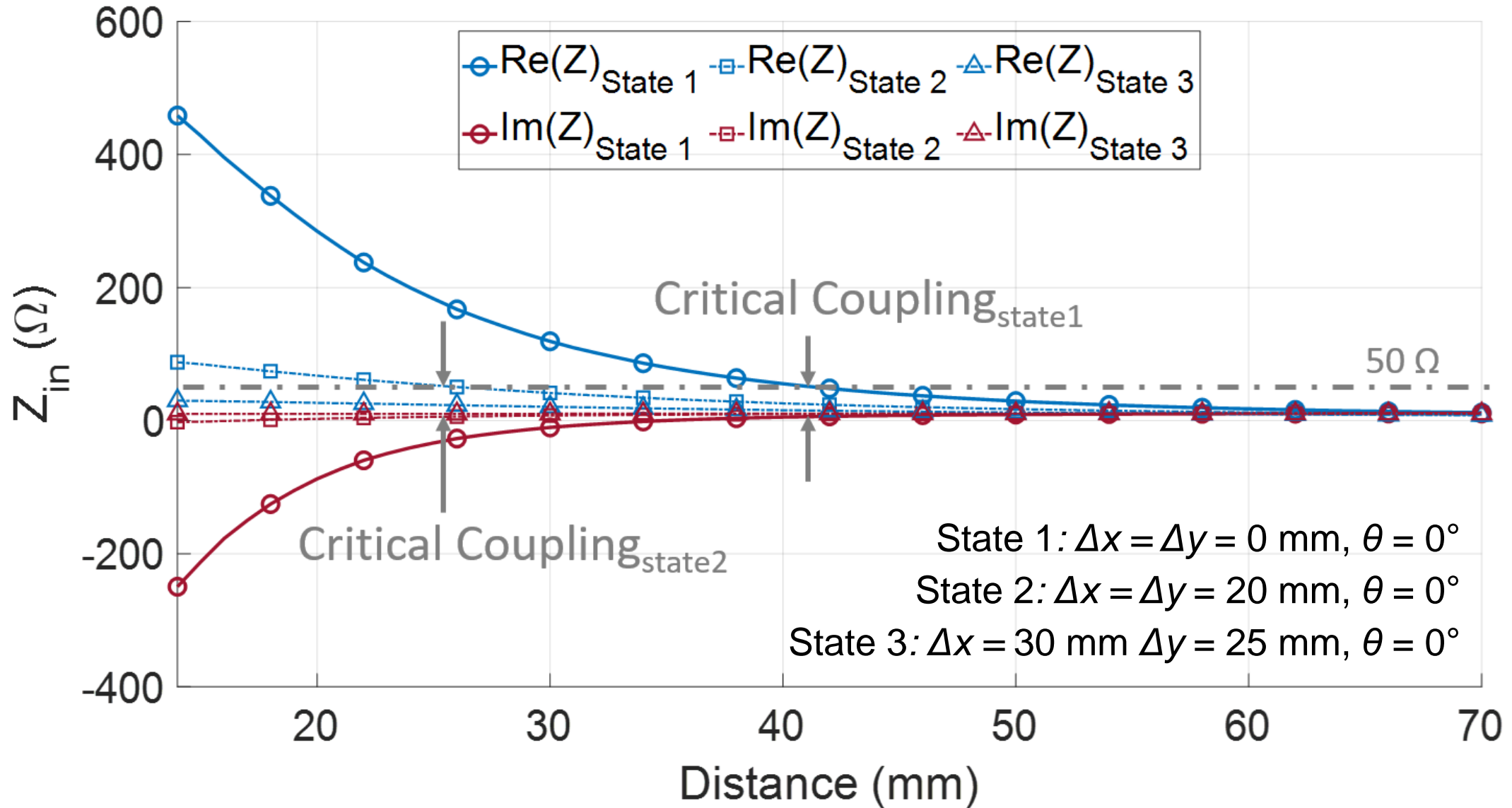


- Neural network with backpropagation using Matlab's toolbox

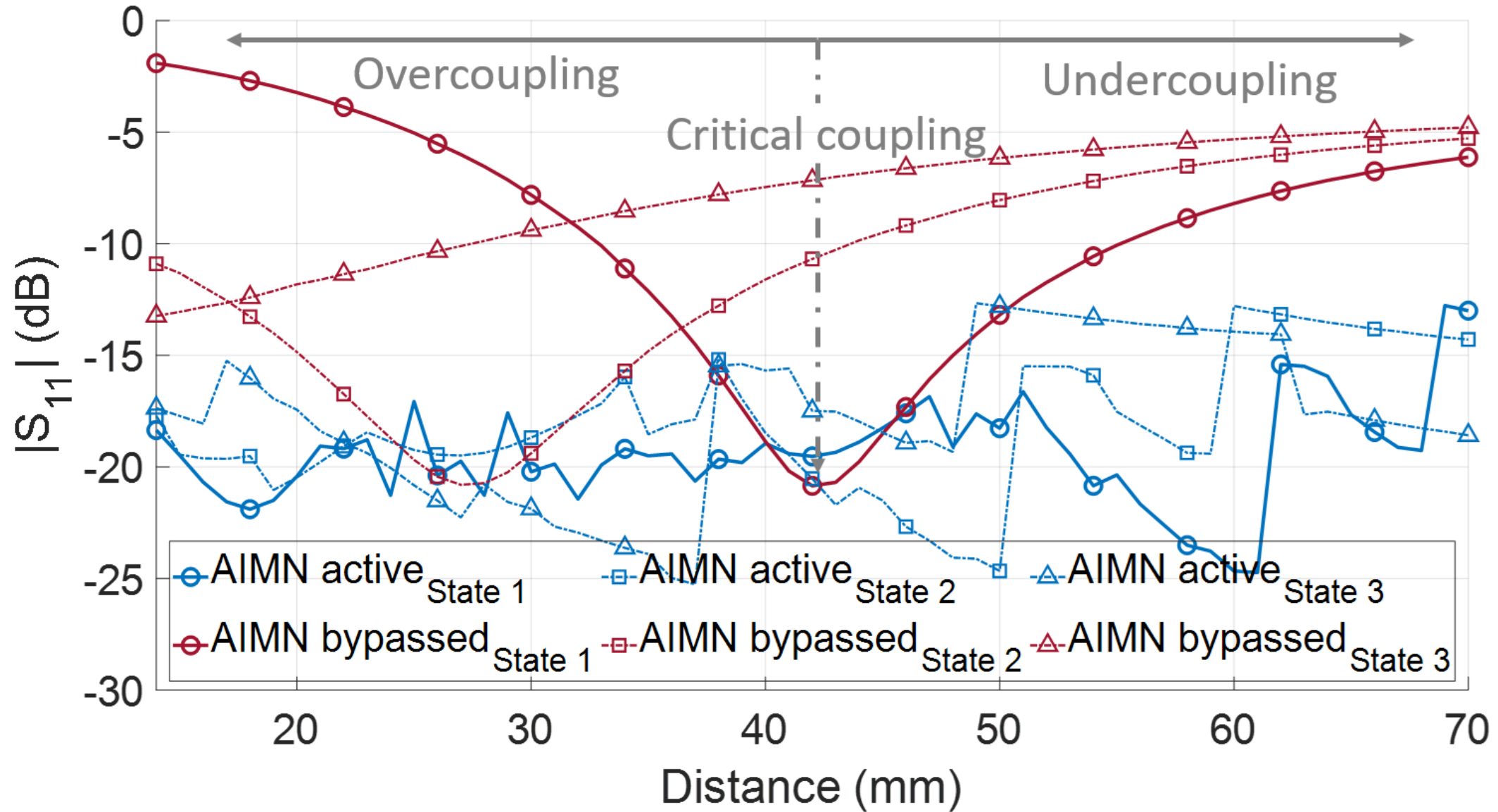


- General dataset created for training-validation
  - $\text{Re}(Z_{in}) = [5-900] \Omega$ ;  $\text{Im}(Z_{in}) = [-100-100] \Omega$ ; 8200 data points
  - AWR controlled through Matlab: AWR optimizer determines  $C_1$ ,  $C_2$ ,  $C_3$
  - 70% Training, 30% Validation
- Measured S-parameters  $\rightarrow Z_{in}$  used to test the network
- Training and validation MSE  $\sim 5\%$ . Test MSE  $\sim 10\%$

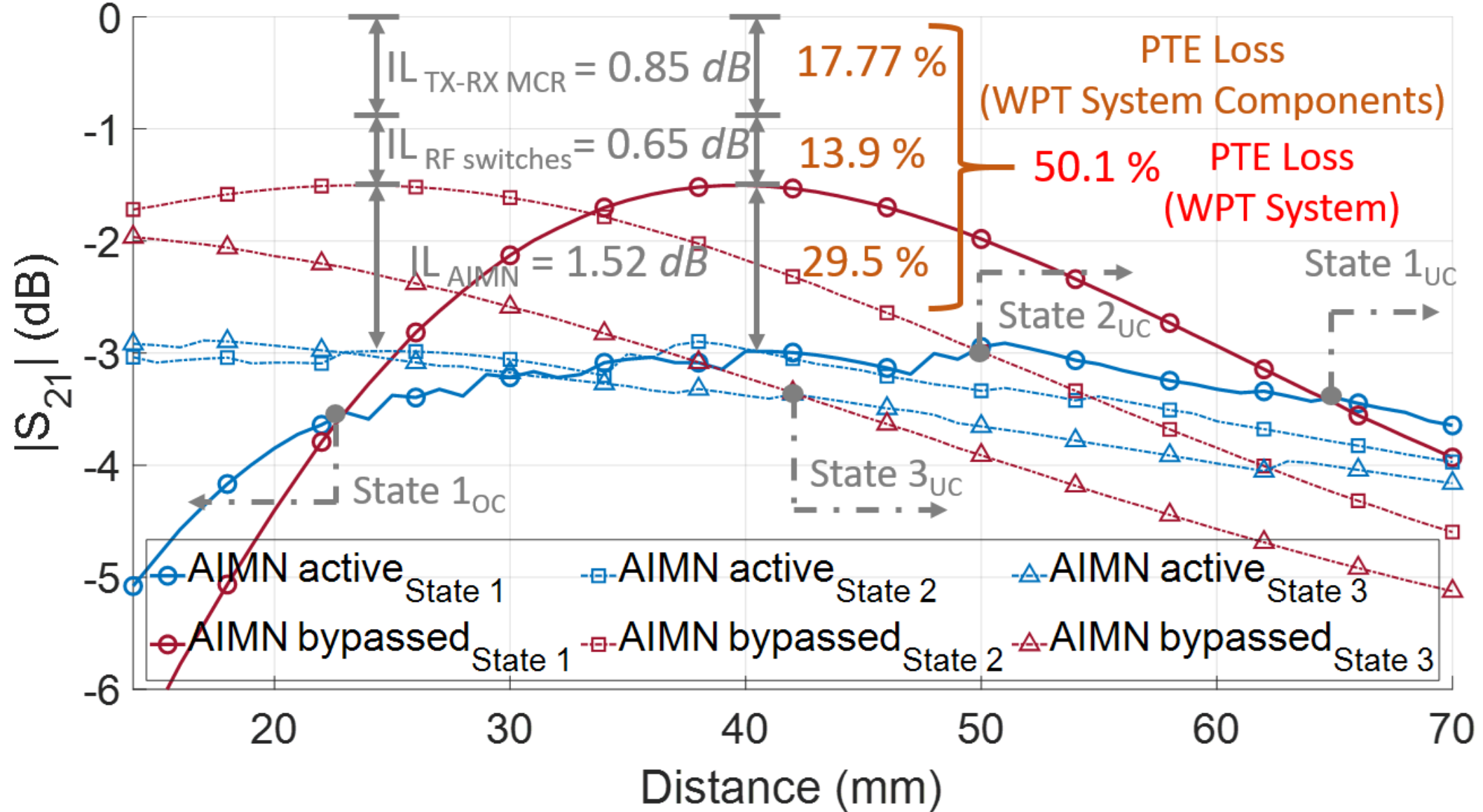
# System performance



# System performance - $S_{11}$



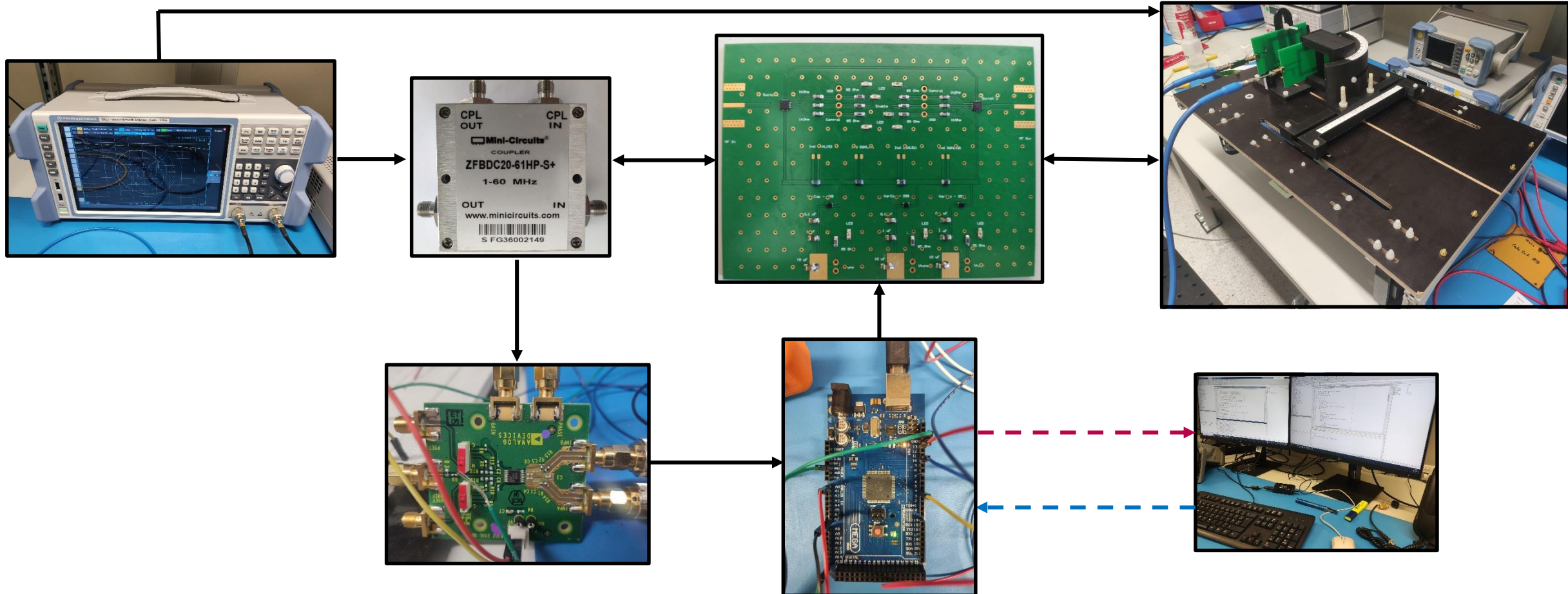
# System performance - $S_{21}$







- Hardware implementation of the prototype

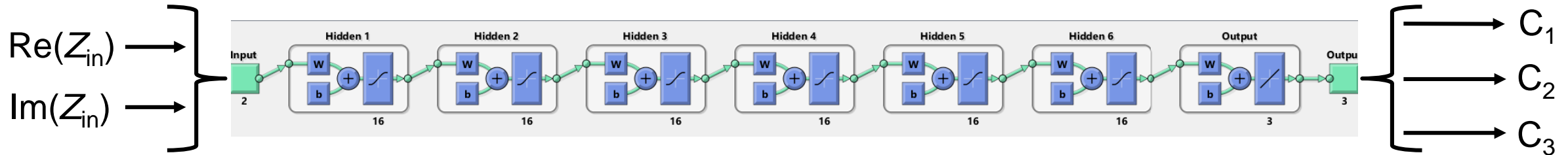




# Thanks for your attention!

- Matlab controls AWR to implement a virtual environment of the adaptive WPT system:
  - Coil measurements  $\rightarrow Z_{in}$  loaded in Matlab and passed to AWR
  - EM simulated AMN implemented in AWR
  - Neural network outputs performed in matlab
  - Impedance detection and AMN control performed in Matlab
  - $S_{11}$  and  $S_{21}$  of the adaptive WPT system determined in AWR
  - Switching between bypass and AMN performed by Matlab

- Neural Network with backpropagation using Matlab's Toolbox



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