

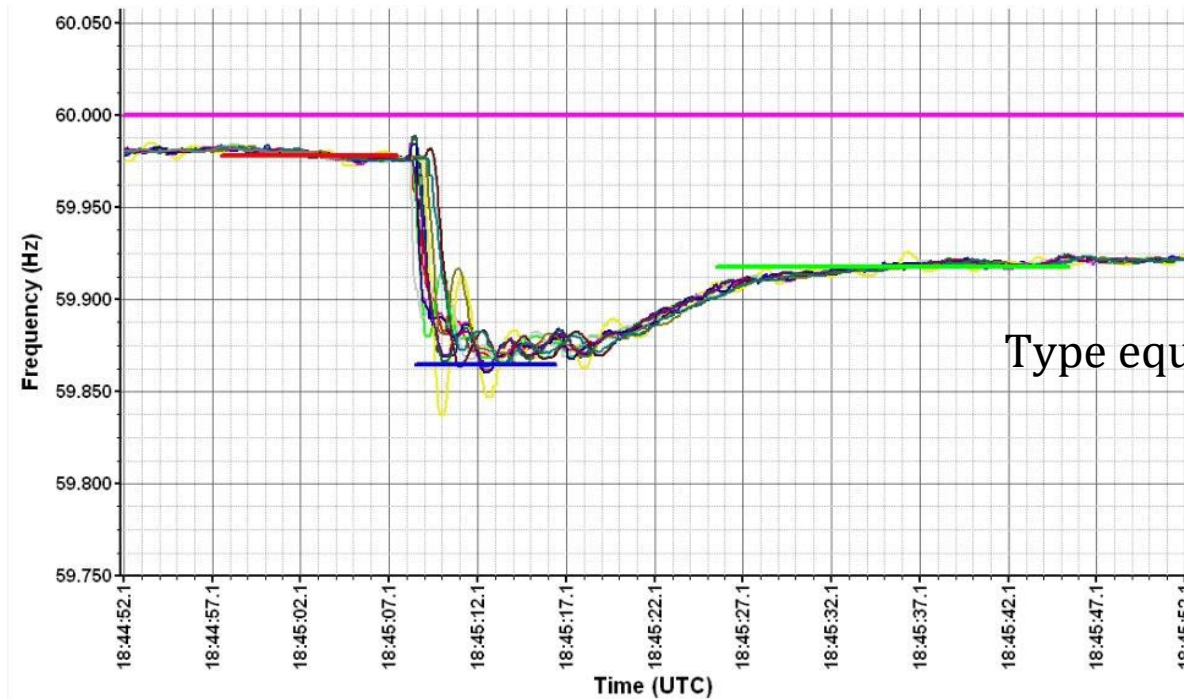


AI-based Transient Frequency Estimation

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Introduction



- PLL detected frequency $< 57\text{Hz} \rightarrow 700$ MW inverter loss

Type equation here.

- Actual grid frequency – $59.8\text{Hz} > 57\text{Hz}$

Frequency Measuring Network Data for Large Resource Loss Event (August 16, 2016, The Blue Cut Fire Event), “NERC 1,200 mw fault induced solar photovoltaic resource interruption disturbance report,” 2017.

Limitations of Traditional Frequency Estimation Methods

TABLE I
P-PMU STANDARD TEST DETAILED RESULTS – BEST PERFORMERS. EACH CELL SHOWS THE NUMBER OF TESTS PASSED.

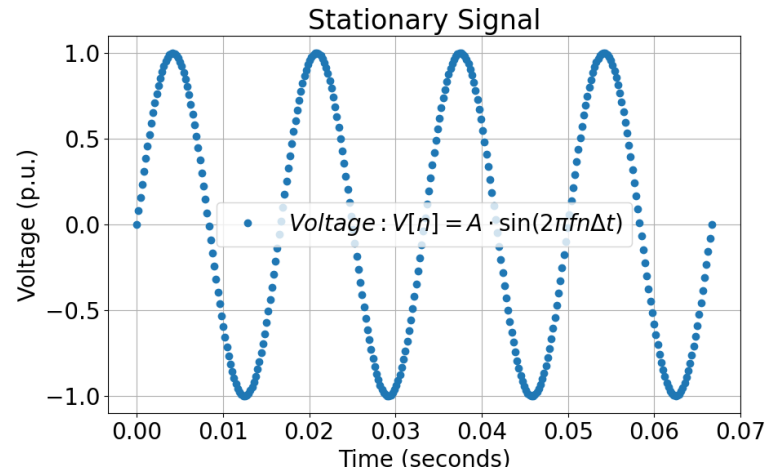
60255-118-1 standard test	Requirement	DFT fit + detector 3ph unfiltered	MATLAB PLL 3ph filtered	EKF + corrector 3ph filtered	ANF + corrector 3ph filtered	Standard DFT 3ph unfiltered	PSCAD PLL 3ph filtered
Steady 60,58 & 62 Hz	$\max FE < 5e-4$ Hz	/ 1	+ 3	+ 3	+ 3	+ 3	+ 3
Harmonics, 2nd-50th	$\max FE < 5e-4$ Hz	+ 49	+ 49	+ 49	/ 48	+ 49	/ 33
Phase mod, 0.1-2 Hz	$\max FE < 0.06$ Hz	+ 20	+ 20	/ 17	/ 17	/ 15	+ 20
Amp mod, 0.1-2 Hz	$\max FE < 0.06$ Hz	+ 20	+ 20	+ 20	+ 20	+ 20	+ 20
± 1 Hz/sec ramp	$\max FE < 0.01$ Hz	- 0	- 0	- 0	- 0	- 0	- 0
± 0.1 Amplitude step	Response time $< 4.5/f_0$	+ 2	+ 2	+ 2	+ 2	+ 2	+ 2
± 10 deg phase step	Response time $< 4.5/f_0$	+ 2	- 0	- 0	- 0	/ 0 - failed by only 3 ms	- 0

- **Good in steady-state**
- **Poor under transient conditions (Ramp signals, phase step signals)**

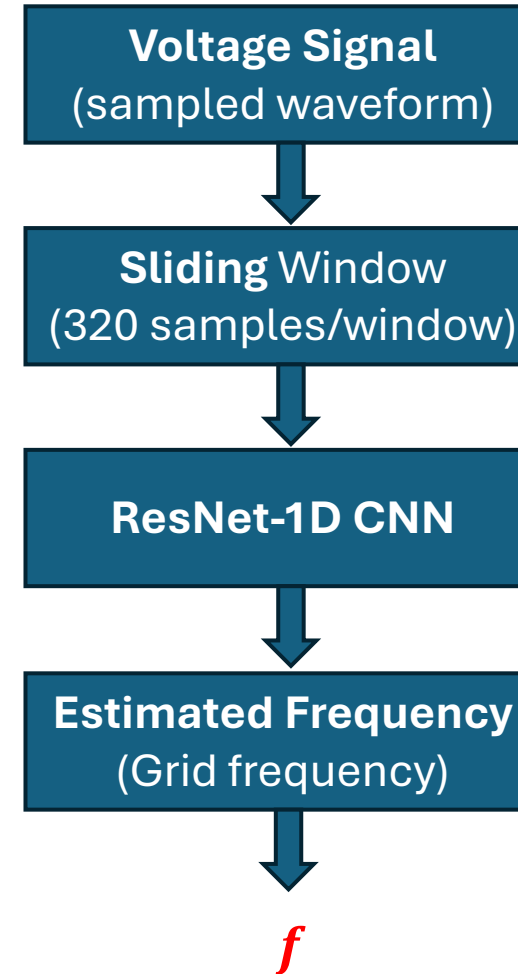
Passed all subtests
 Passed some subtests
 Failed all subtests

Performance of Traditional Frequency Estimation Methods under PMU Standard Tests (J. Ting and et al, “Evaluating methods for measuring grid frequency in low-inertia power systems,” in KPEC, pp. 1–6, 2022.)

Method : ResNet-1D CNN



Training Signal: $V[n] = A \cdot \sin(2\pi f n \Delta t)$



- Supervised learning
- Fixed frequency for each channel of the training data
- Sampling rate: 4800Hz
- Training frequency range: 58-62Hz

Test Results I

P-PMU Standard

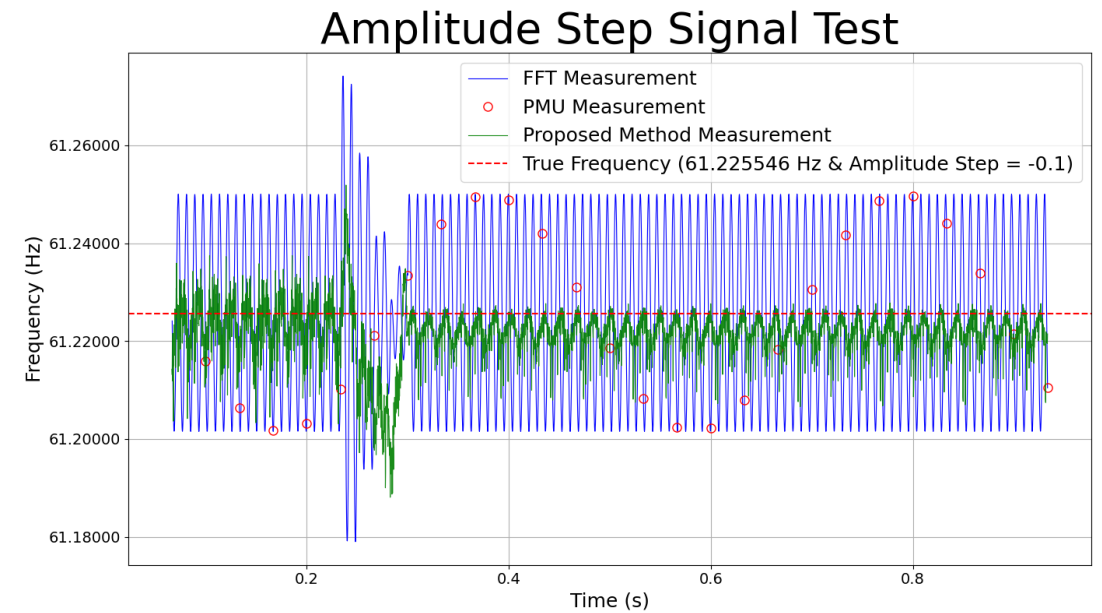
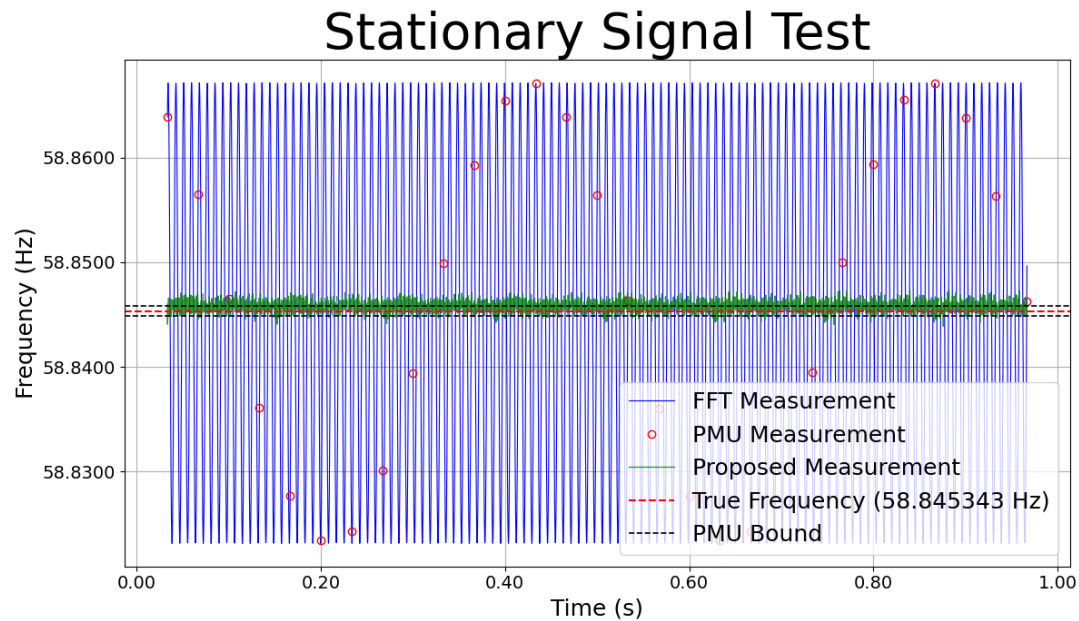
60255-118-1 Standard Test	Requirement
Steady (58-62 Hz)	$\max FE < 0.0005 \text{ Hz}$
Phase Modulation (0.1-2 Hz)	$\max FE < 0.006 \text{ Hz}$
Amplitude Modulation (0.1-2 Hz)	$\max FE < 0.006 \text{ Hz}$
Ramp ($\pm 1 \text{ Hz/sec}$)	$\max FE < 0.01 \text{ Hz}$
Amplitude Step (± 0.1)	Response time $< 4.5/f_0$
Phase Step (± 1 degree)	Response time $< 4.5/f_0$

Test Results

Tested Signals	Error
Stationary Signal (60.147748 Hz)	0.00030 Hz
Phase Modulation (0.1 Hz)	0.00129 Hz
Amplitude Modulation (2 Hz)	0.00486 Hz
Ramp Signal (2Hz/s)	0.00223 Hz

- After training, the final mean error of tested stationary signal was approximately **0.0005 Hz** that meet PMU requirement.
- The model performed well not only for stationary signal, but also for the transient signals.

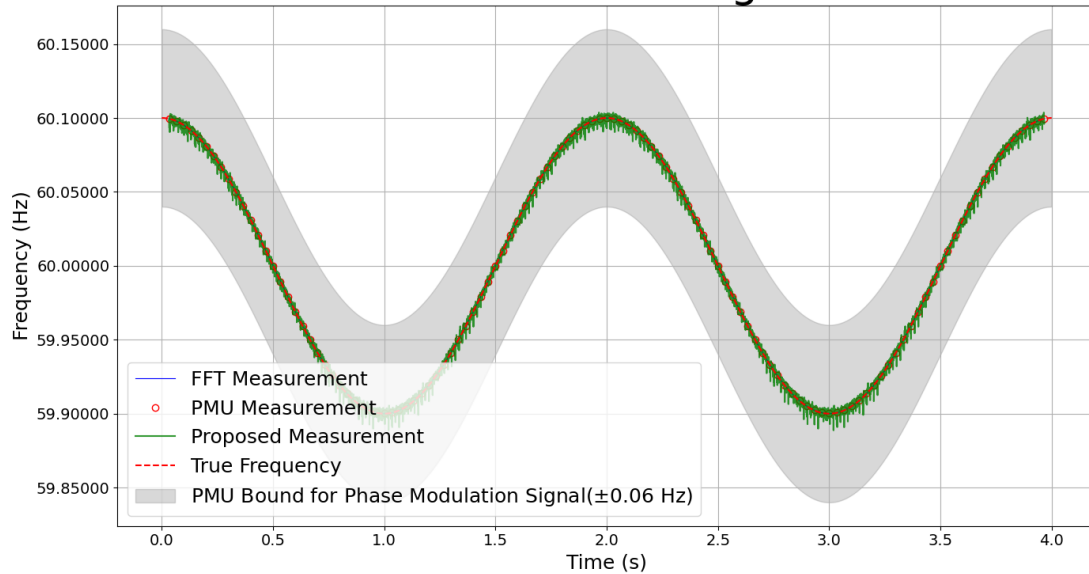
Test Results II



- The performance of proposed method is more accuracy than traditional method

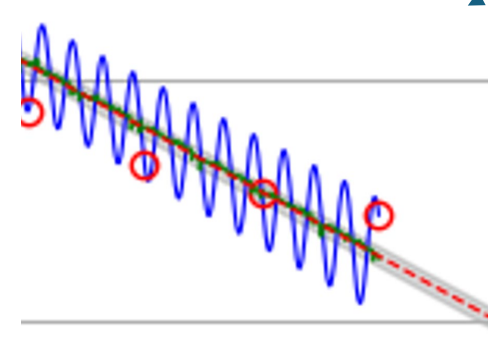
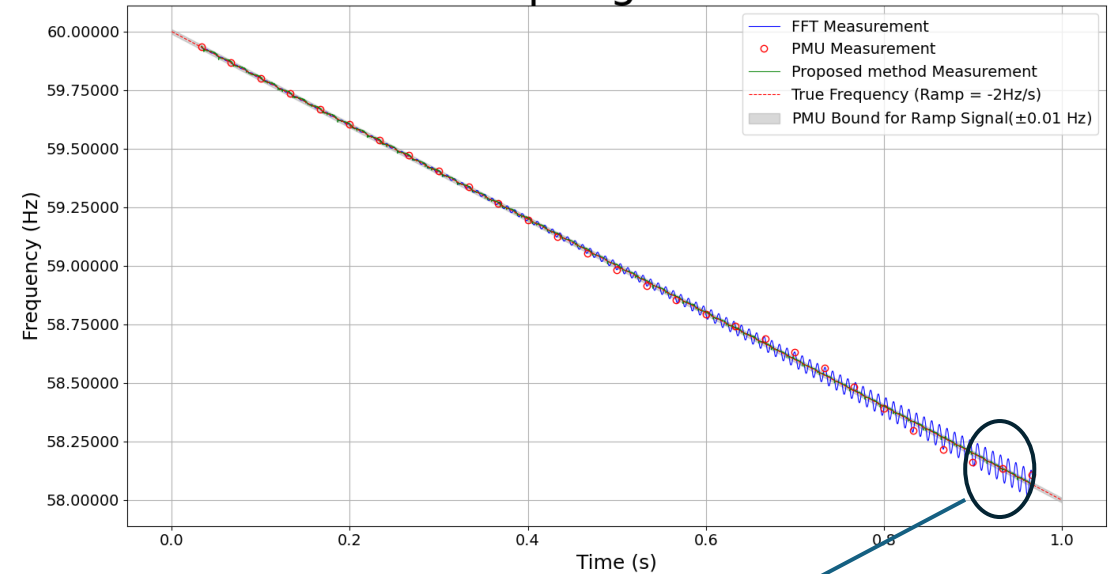
Test Results III

Phase Modulation Signal Test



- The results show that the model also performs very well for the signals with a dynamic frequency.

Ramp Signal Test



Conclusion

- The first effort applying AI to transient frequency measurement in power systems
- Proposed AI-based frequency estimation using ResNet-1D CNN
- Accurate for both steady-state and transient signals

Future work:

- To explore advanced AI models (e.g., Transformer) for improved performance
- To test the method using simulation data (e.g., PSCAD)
- To use more different signals as the training data

Thank you



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