

# Signal Estimation by Prony's Method for Application to ADC Testing

*Siwei Li, Anna Kuwana, Yuki Yanadori, Shogo Katayama,*

*Keno Sato, Takashi Ishida, Toshiyuki Okamoto, Tamotsu Ichikawa*

*Kentaroh Katoh, Takayuki Nakatani, Kazumi Hatayama, Haruo Kobayashi*

*Gunma University  
Rohm Semiconductor*



# Contents

---

- Research Background and Objective
- Principle of Prony's Method
- Simulation Results
- Conclusion

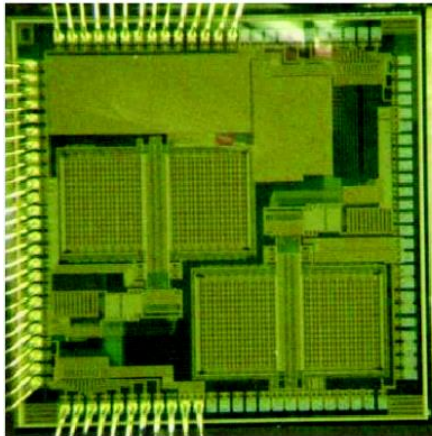
# Contents

---

- Research Background and Objective
- Principle of Prony's Method
- Simulation Results
- Conclusion

# Research Background: ADC Testing

For high performance analog-to-digital converters (ADCs), their low-cost, high-quality testing techniques are becoming more important.



ADC Chip



LSI Tester  
for mass production at shipping stage

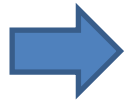
# FFT and ADC Testing

For ADC testing, Fast Fourier transform (FFT) is used for signal frequency estimation.

- **Advantage**: Accurate estimation of output spectrum.

Window function can be used even if not coherent sampling

- **Disadvantage**: A large number of sample values are required.



**Suitable** for mass production testing at shipping stage

**Not suitable** for on-line/field testing

# Prony Method

- Prony method [1]

- Advantage:** Use only a small number of sampled data for original signal estimation.

- Disadvantage:** Not very accurate estimation

[1] C. Prony, F.M. Gaspard and R. De Baron, "Essai Experimental et Analytique". *Journal de l'école Polytechnique de Paris*, Vol. 1, pp. 24-76 1795.

# Research Objective

---

- With the aim of applying the Prony's method to ADC on-line/field testing, this study investigates the noise effect on its estimation accuracy.
- % On-line testing system for ADC must be simple.

# Our Approach

---

- Find the limit of noise magnitude to obtain meaningful estimation.
- Clarify the relationship between noise magnitude and estimation accuracy when the noise is smaller than limit.



# Contents

---

- Research Background and Objective
- Principle of Prony's Method
- Simulation Results
- Conclusion

# Waveform Under Estimation

Cosine wave input

- Input signal frequency:  $f$
- Sampling frequency:  $f_s$
- Sine wave parameters:
  - $A$ : Amplitude,  $\theta$ : Initial phase,  $d$ : DC offset
- Specimen value of point at  $n$

$$x(n) = A \cos\left(\frac{2\pi f n}{f_s} + \theta\right) + d$$

# Principle of Prony's Method

- Replace 4 points;  $x(n)$ ,  $x(n+1)$ ,  $x(n+2)$ ,  $x(n+3)$

$$a = \frac{\{x(n) - x(n+3)\}}{\{x(n+1) - x(n+2)\}}$$

$$z_r = \frac{(a - 1)}{2}$$

$$f = f_s \frac{\left\{ \arg\left(z_r + j\sqrt{(1 - z_r^2)}\right) \right\}}{2\pi}$$

Estimate  $f$  from 4 points of sampled values

# Principle of Prony's Method

Calculation from 4 points;  $x(n)$ ,  $x(n+1)$ ,  $x(n+2)$ ,  $x(n+3)$

$$a = \frac{\{x(n) - x(n+3)\}}{\{x(n+1) - x(n+2)\}}$$

$$z_r = \frac{(a - 1)}{2}$$

$$f = f_s \frac{\left\{ \arg\left( z_r + j \sqrt{(1 - z_r^2)} \right) \right\}}{2\pi}$$

Must be positive or zero

If negative, fatal error: NaN (Not a Number)

# Contents

---

- Research Background and Objective
- Principle of Prony's Method
- **Simulation Results**
- Conclusion

# Problem Setting

- “Original waveform”

Sine wave with

Frequency: 1.0

Amplitude: 1.0

Initial phase: 0.1

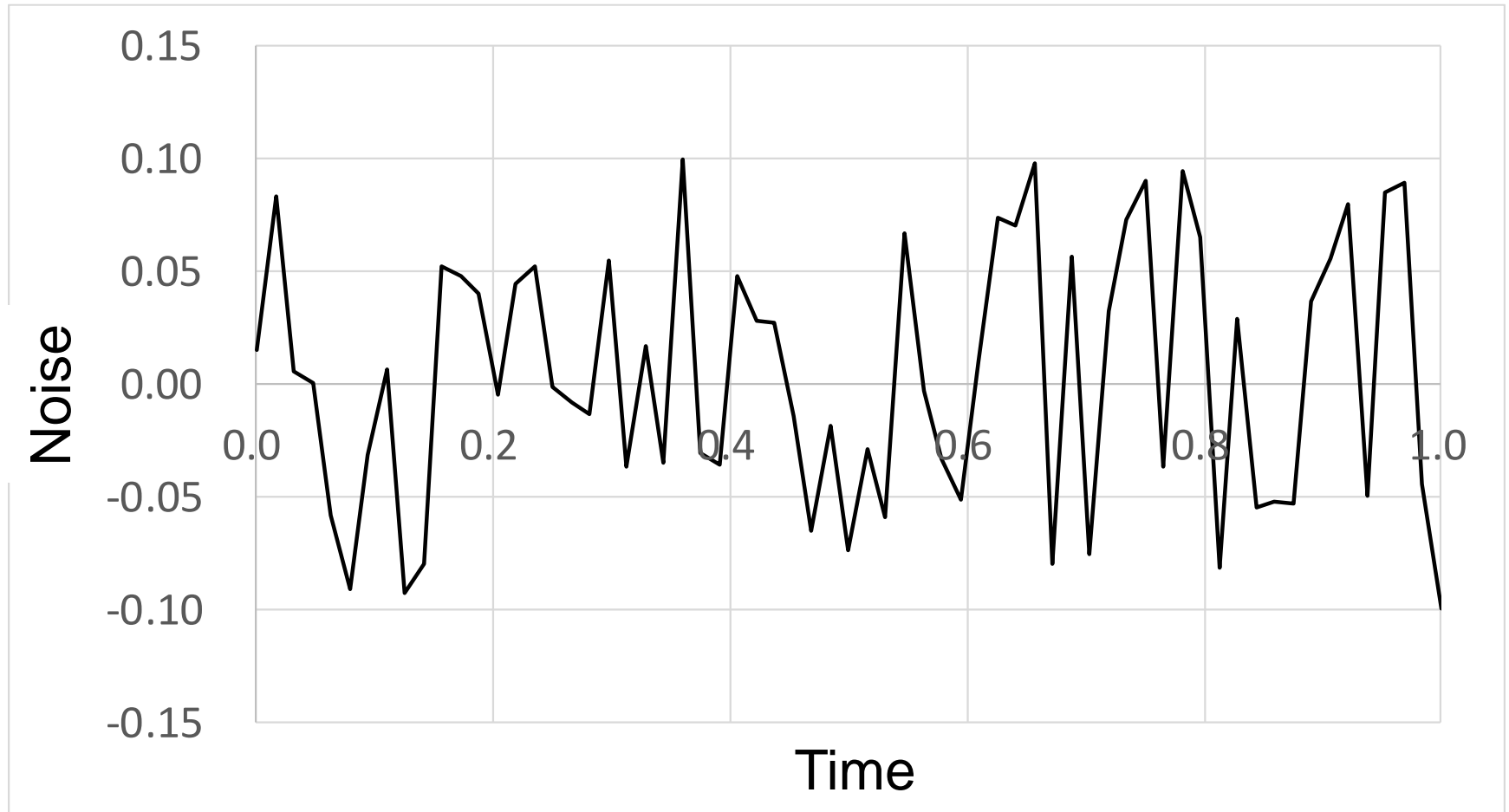
DC component: 1.0

- Number of Samples: 4

- Superimposed “Noise”

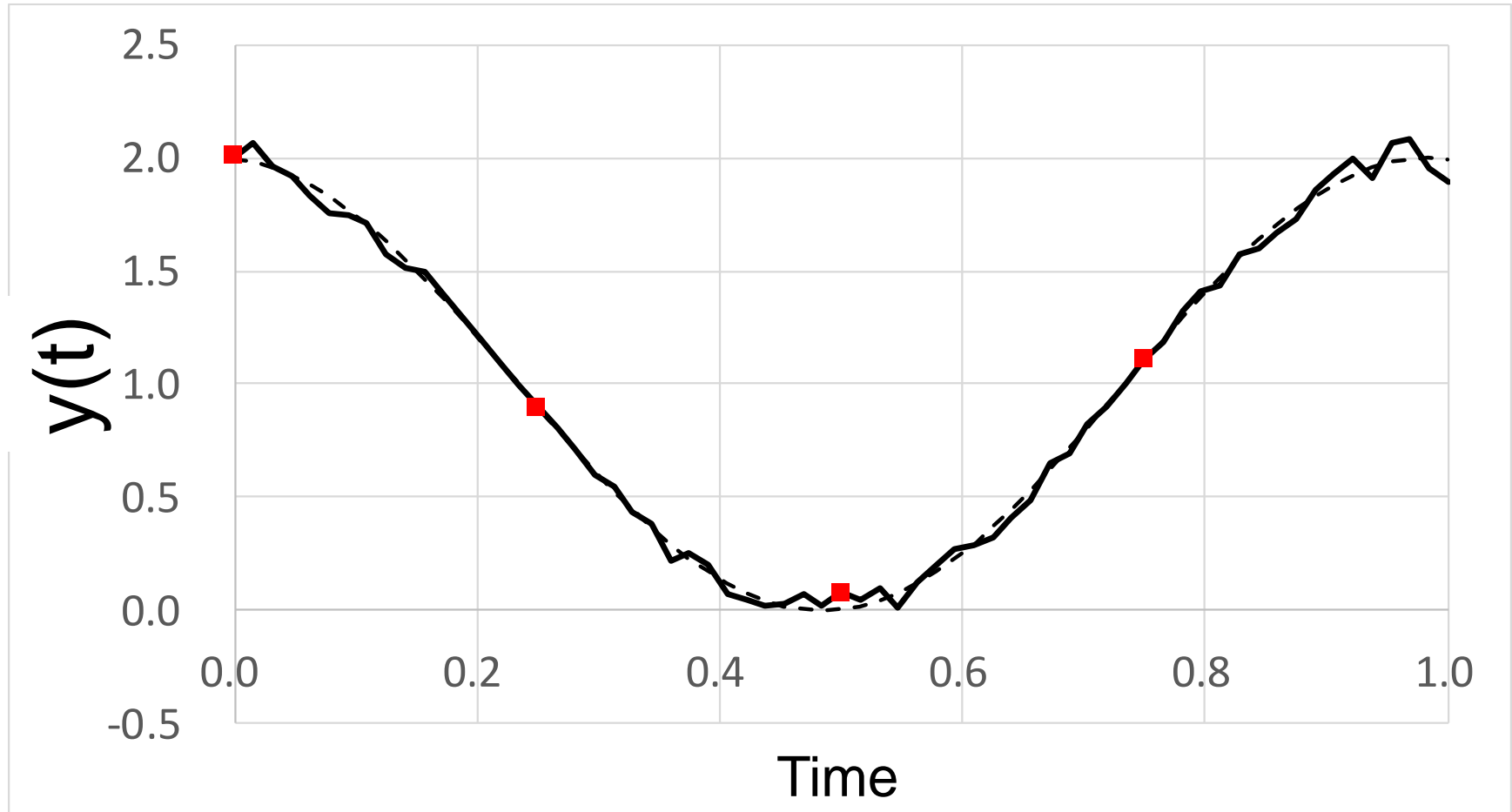
A random number sequence generated by standard C rand function

# Noise Superimposed to Original



Noise for NR (Noise Ratio)=0.2

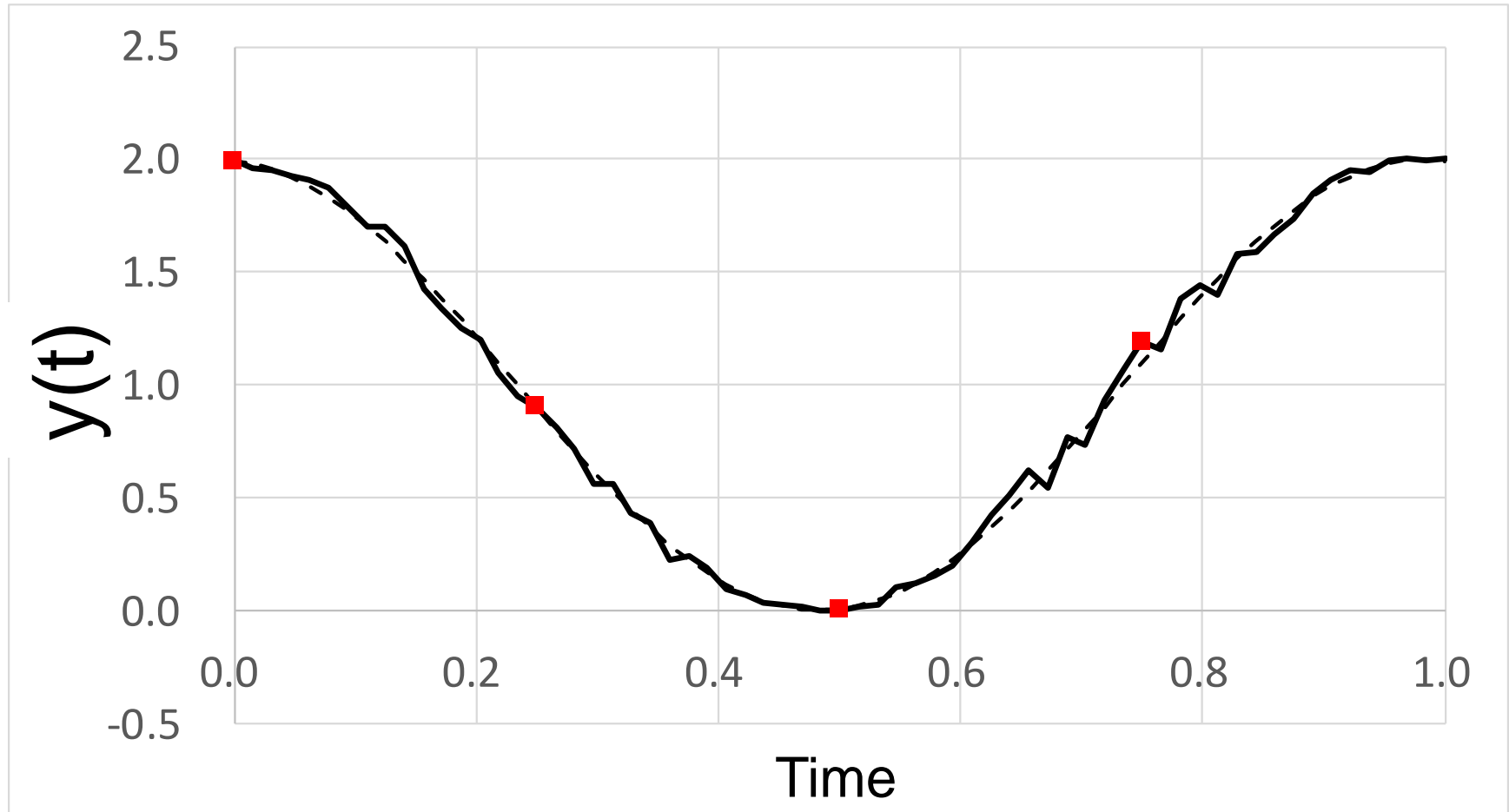
# Amplitude Modulation Noise



$$y(t) = A\{1 + a(t)\} \cos\left\{\frac{2\pi f t}{f_s} + \theta_0\right\} + d$$

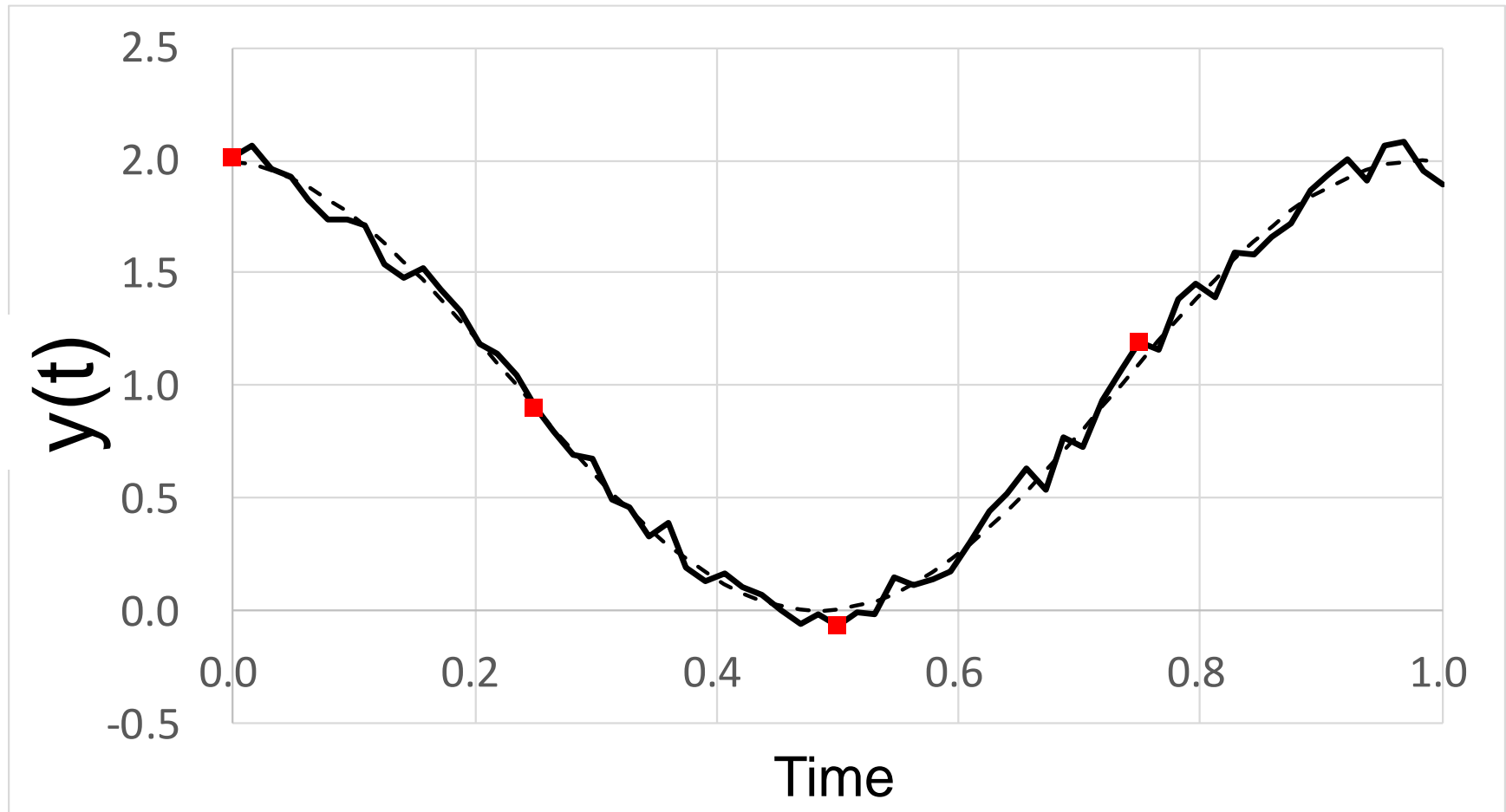


# Phase Noise



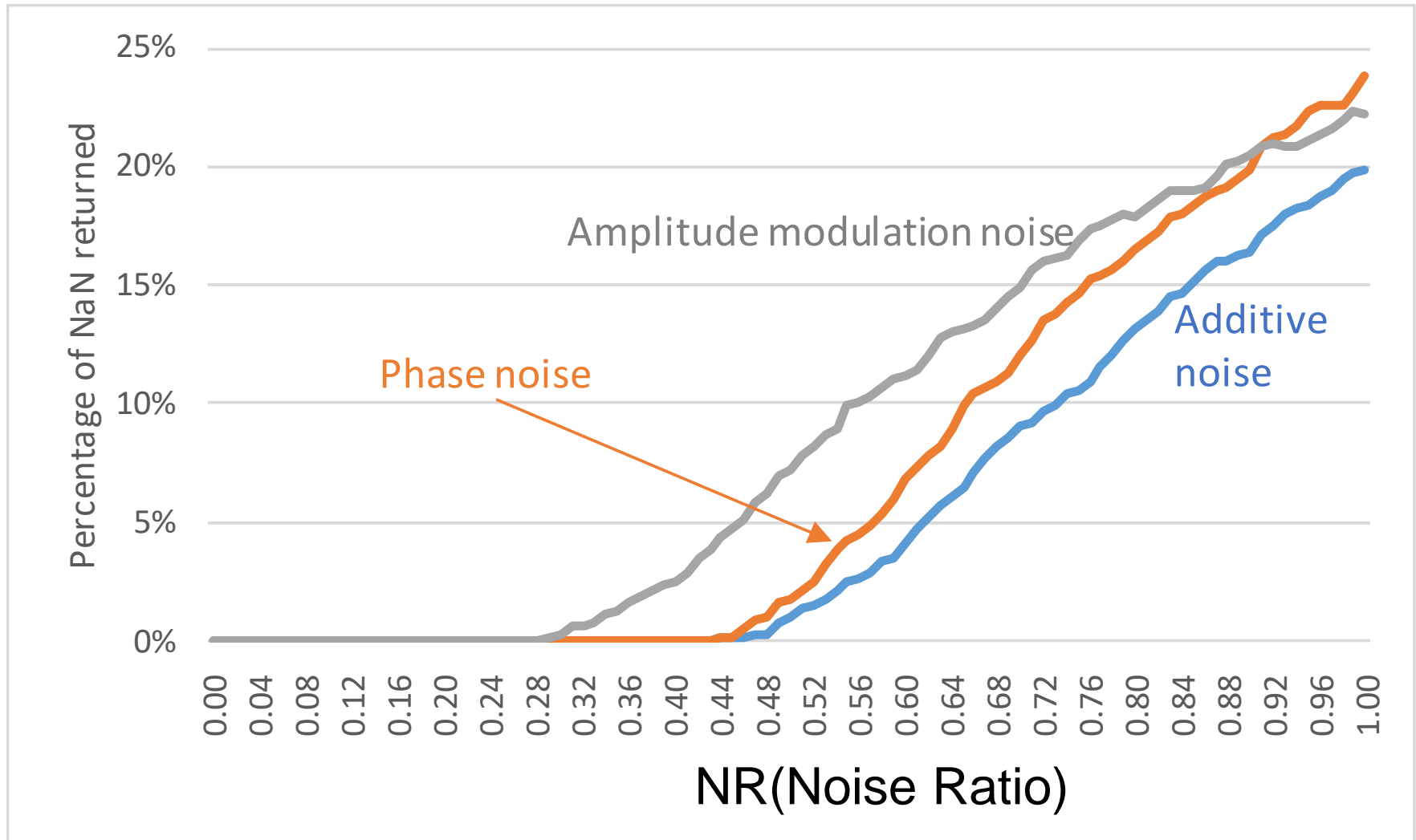
$$y(t) = A \cos \left\{ \frac{2\pi f t}{f_s} + \theta_0 + \theta(t) \right\} + d$$

# Additive Noise



$$y(t) = A \cos \left\{ \frac{2\pi f t}{f_s} + \theta_0 \right\} + d \{ 1 + c(t) \}$$

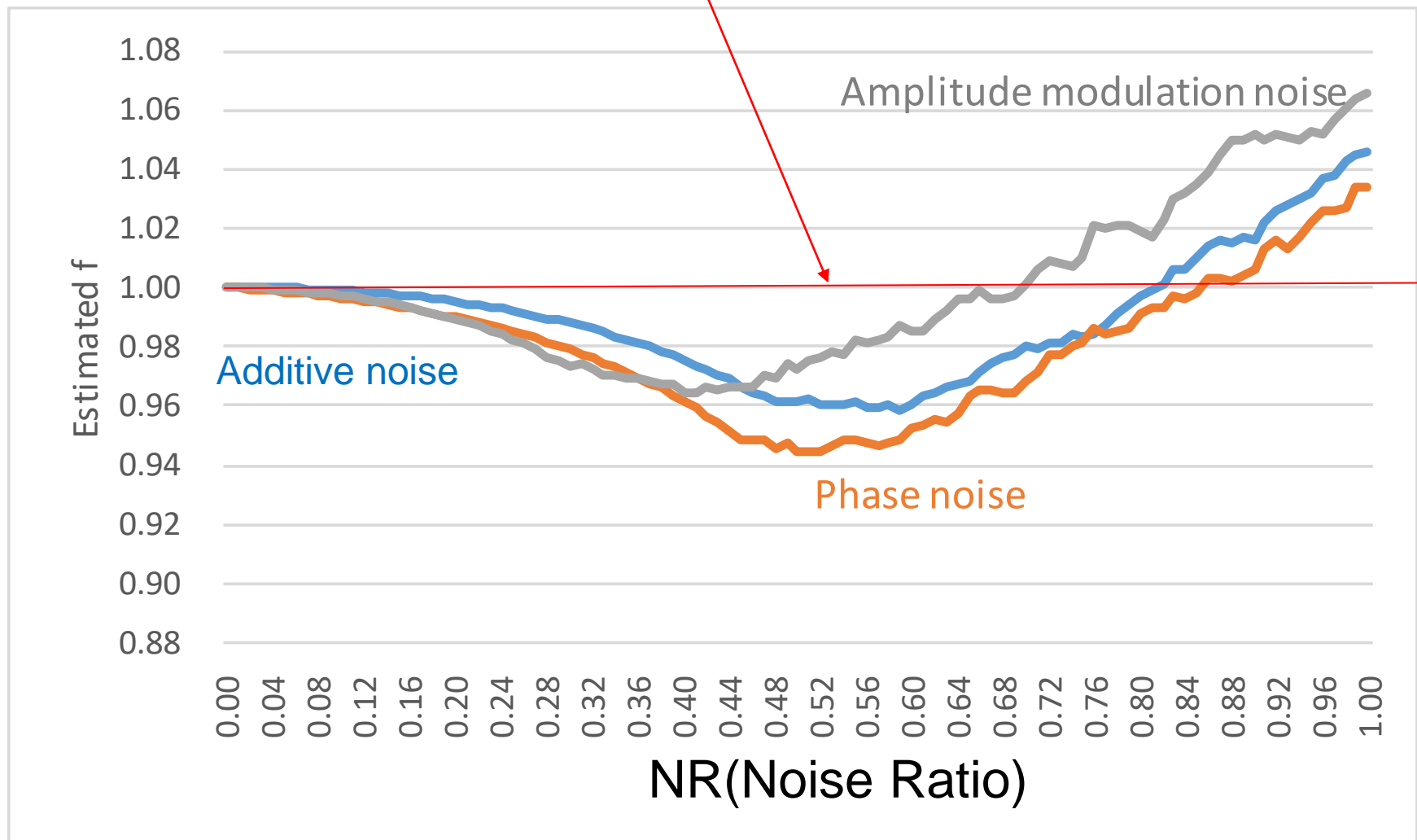
# Fatal Estimation Error



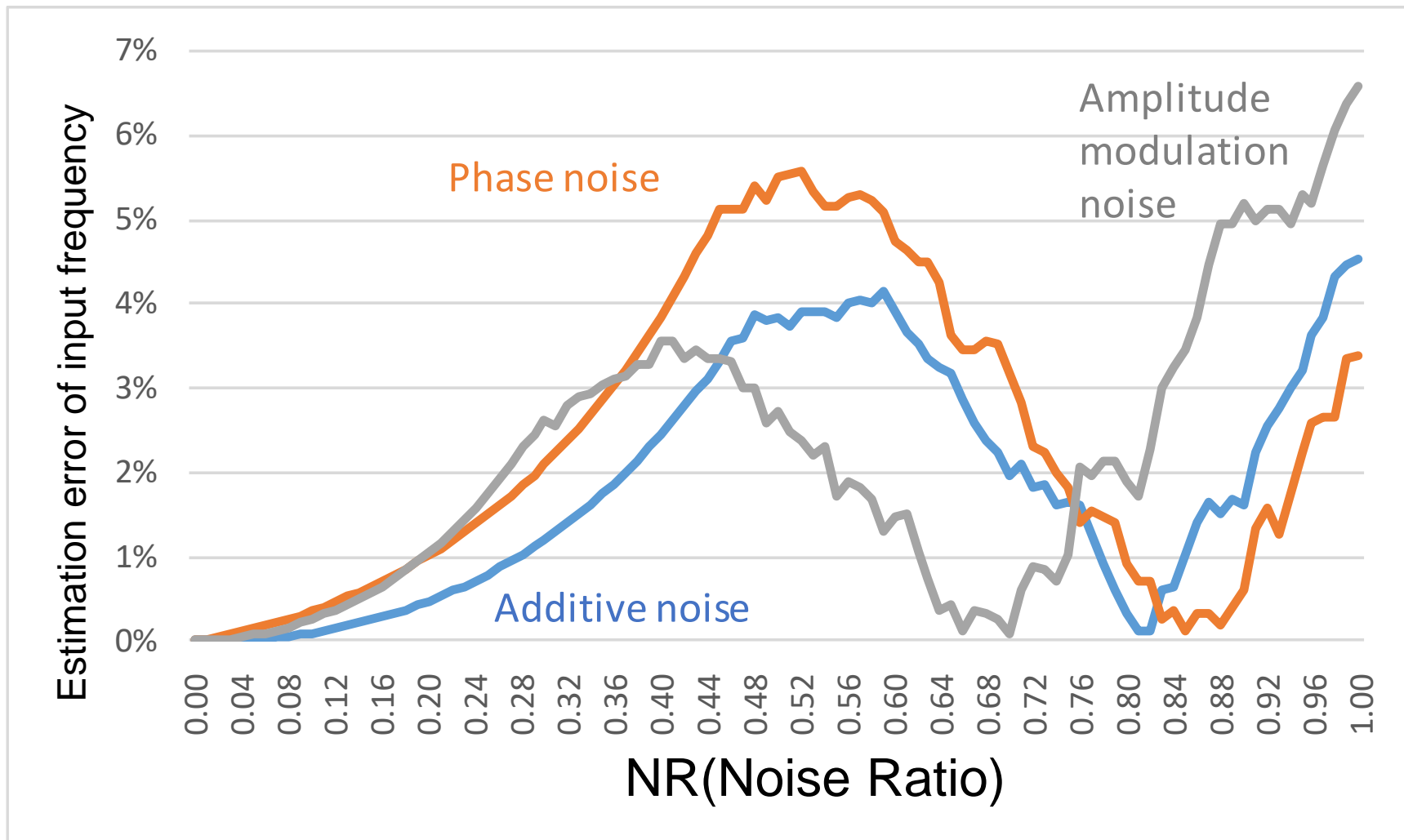
Number of times of NaN (Not a Number) for estimating 1000 times

# Estimation of Input Frequency

Correct frequency  $f=1.0$



# Estimation Error of Input Frequency



Absolute value of error between estimated and original frequency

# Contents

---

- Research Background and Objective
- Principle of Prony's Method
- Simulation Results
- Conclusion

# Conclusion

- Focused on Prony's method for estimating original waveform using a few sampled values, which is very simple.
- Investigated effects of additive noise, phase noise and amplitude modulation noise
  - When noise is large, meaningful values cannot be obtained because the root in the algorithm cannot be calculated.
  - Limits of noise magnitude for Prony's method were found.
  - Below the limits, estimation error increases exponentially as the noise magnitude increases.
- Next work:

We will show quantitatively that Prony's method is applicable for on-line/field ADC testing because it requires only a small number of sampled data.



ご清聴ありがとうございました

Thank you for lattention

謝謝

Merci de votre attention