

A vintage green and red car with a yellow convertible top is the central focus. The car has a license plate that reads '2005'. In the background, there are faint technical diagrams, including a cross-section of a car engine and a diagram of a car's suspension system. The car is parked on a dirt road with a green field and mountains in the background.

# 6. Real Signal Wavelet Transform

Instrumentation Systems Lab. Prof. Zhang Zhong

# 5. Image processing by Wavelet Transform

## 5.1 2D-Discrete Wavelet Transform

1) Calculation method 2) Characters

## 5.2 2D-Complex Wavelet Transform

Calculation method, 2D-Mother Wavelets,  
Translation invariance property of 2D-CDWT

## 5.3 Application on de-noising

Model Image, Inspection of metallic surface

## 5.4 Direction detection

Calculation method, Extracting fingerprint and  
crack in a grass Braun table

# Important point in the CWT

## 1) Definition of the CWT

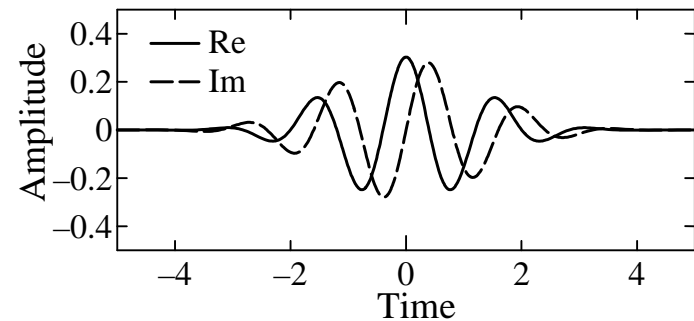
$$w(a,b) = \int_{-\infty}^{\infty} f(t) \overline{\psi}_{a,b}(t) dt$$

$$\psi_{a,b}(t) = \frac{1}{\sqrt{a}} \psi\left(\frac{t-b}{a}\right)$$

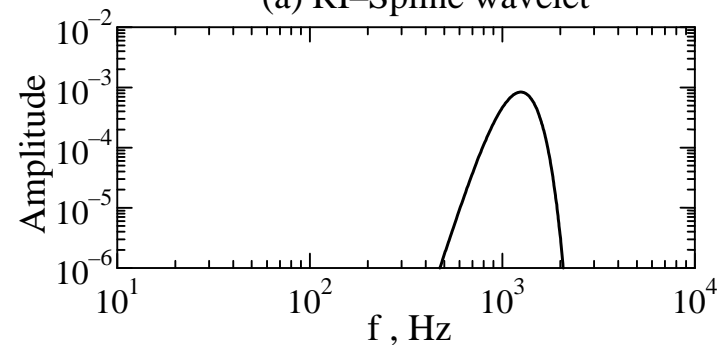
$\psi(t)$  : Mother Wavelet (MW)

$a$  : Scale ( $1/a$  Frequency)

$b$  : Time



(a) RI-Spline wavelet



(b) Frequency characteristic

## 2) Example of the CWT

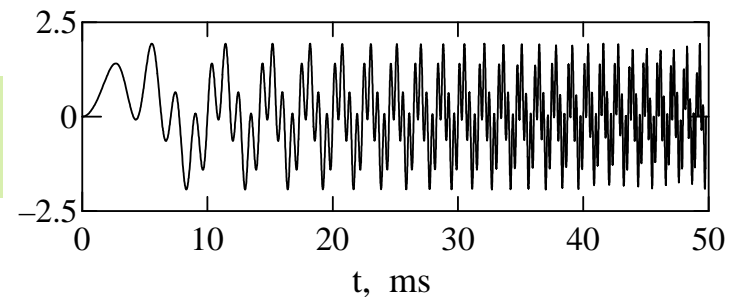
$$w(a,b) = \int_{-\infty}^{\infty} f(t) \overline{\psi}_{a,b}(t) dt$$

$$\psi_{a,b}(t) = \frac{1}{\sqrt{a}} \psi\left(\frac{t-b}{a}\right)$$

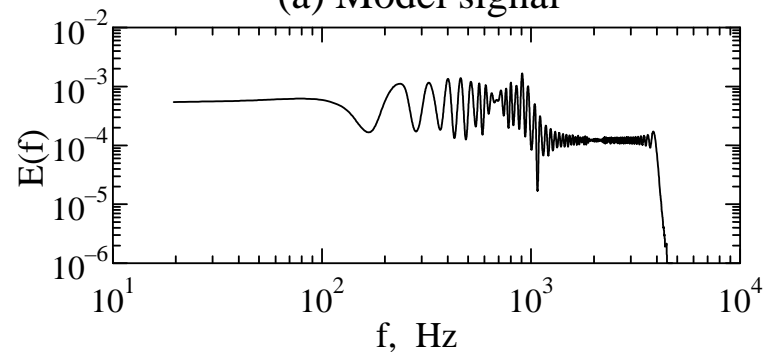
$\psi(t)$  : Mother Wavelet (MW)

$a$  : Scale ( $1/a$  Frequency)

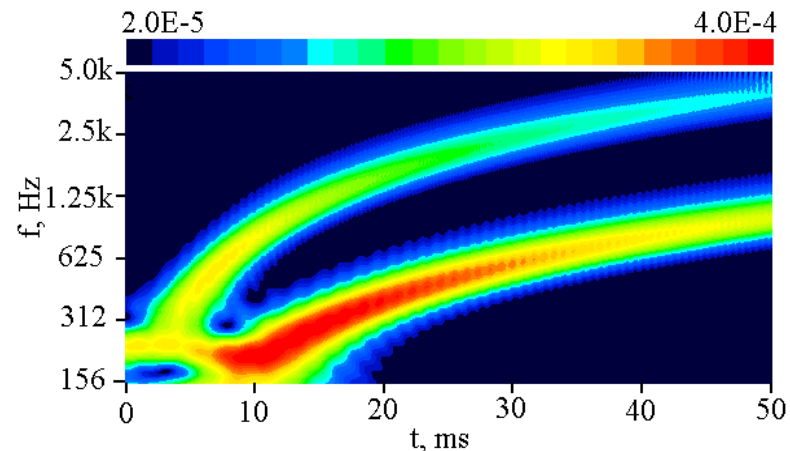
$b$  : Time



(a) Model signal



(b) Power spectrum



(c) Wavelet transform

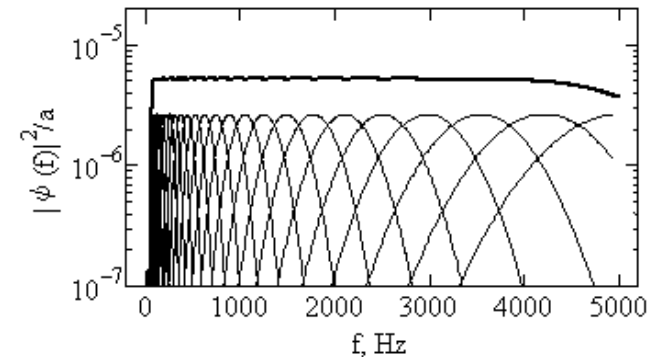
### 3) Features of the CWT

#### Advantages:

- Transforming signal to time-frequency plane and making its nature clearly (illustrating)
- Time and frequency resolution can be changed with frequency

#### Problems:

- Redundancy bases
- How do select Mother wavelet?
- There isn't a common fast algorithm for calculation.
- Can not detection of abnormal milt-components



(b) Basis of CWT for 6 octave, 4 divided

## 4) Condition of the MW

$$w(a, b) = \int_{-\infty}^{\infty} f(t) \overline{\psi}_{a,b}(t) dt$$
$$\psi_{a,b}(t) = \frac{1}{\sqrt{a}} \psi\left(\frac{t-b}{a}\right)$$

$\psi(t)$  : Mother Wavelet (MW)  
 $a$  : Scale ( $1/a$  Frequency)  
 $b$  : Time

**Condition of The MW (admissibility condition):**

$$C_{\psi} = \int_{-\infty}^{\infty} \frac{|\hat{\psi}(\omega)|^2}{|\omega|} d\omega < \infty$$

**This condition can be sampled as following Equation:**

$$\int_{-\infty}^{\infty} \psi(t) dt = 0$$

So many MW have been proposed and how do select them be comes problem.

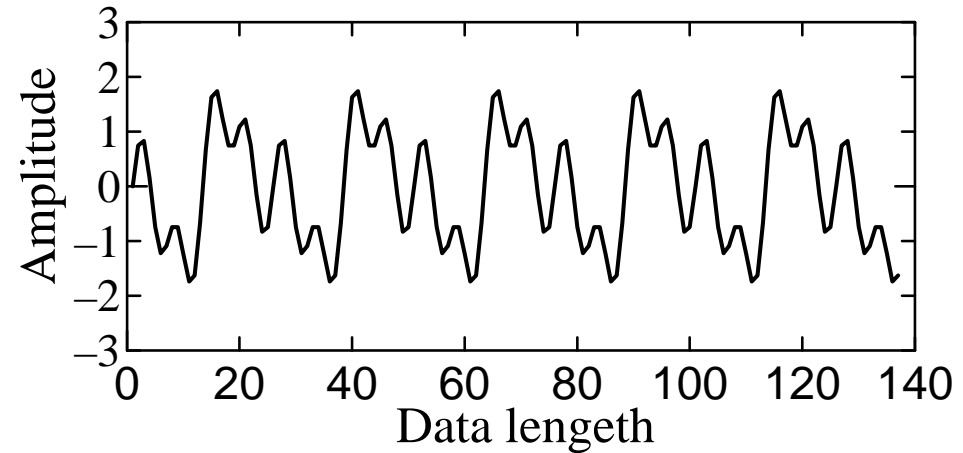
# 6.1 Construction of Real-Signal MW

## 1) Selection of window function

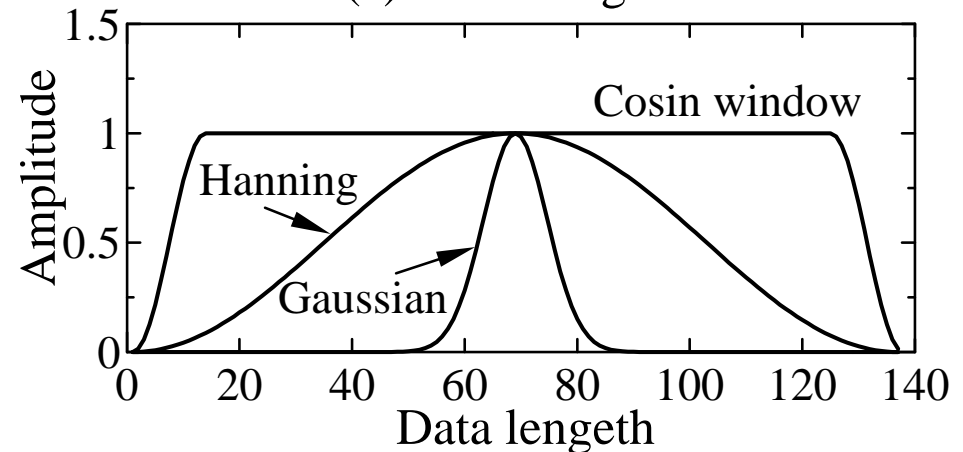
### 1) Model signal

$$f(k) = \sin\left(\frac{2\pi k}{25}\right) + 0.7 \sin\left(\frac{2\pi k}{12}\right) + 0.7 \sin\left(\frac{2\pi k}{6}\right)$$

2) Multiplying the real signal with a window function and removing the average for making it becomes zero sufficiently quickly at the distant point



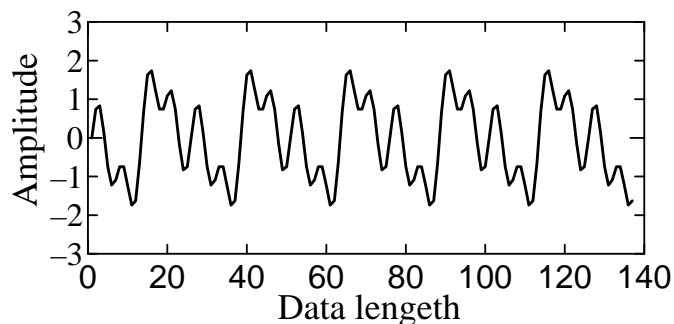
(a) Model Signal



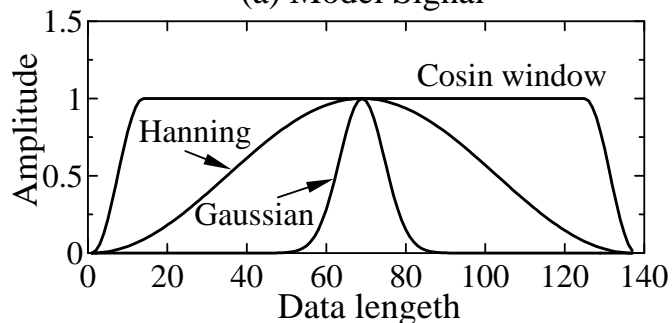
(b) Window functions

## 2) Example of the RMW

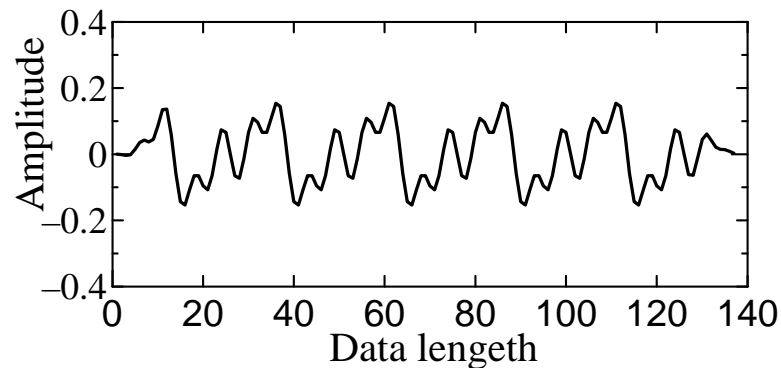
Influence of the Window function



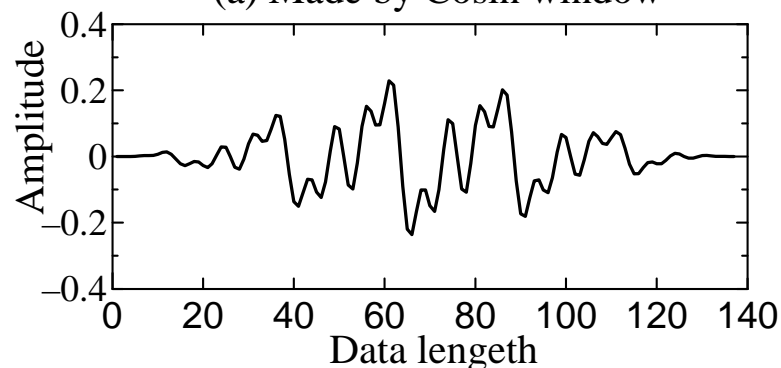
(a) Model Signal



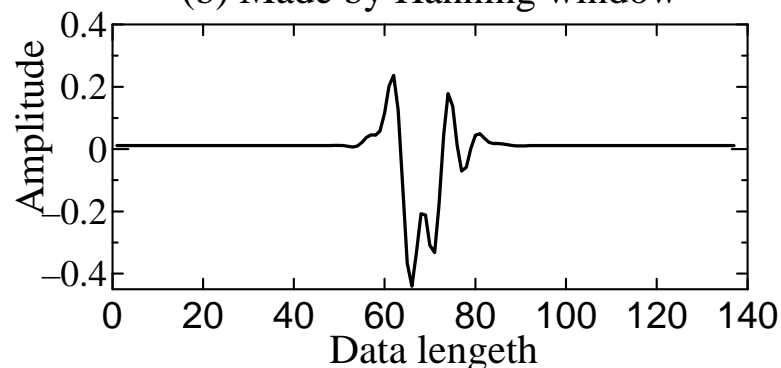
(b) Window functions



(a) Made by Cosin window



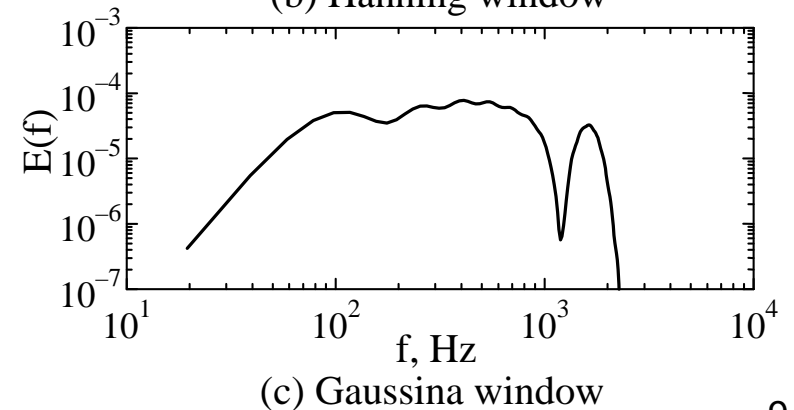
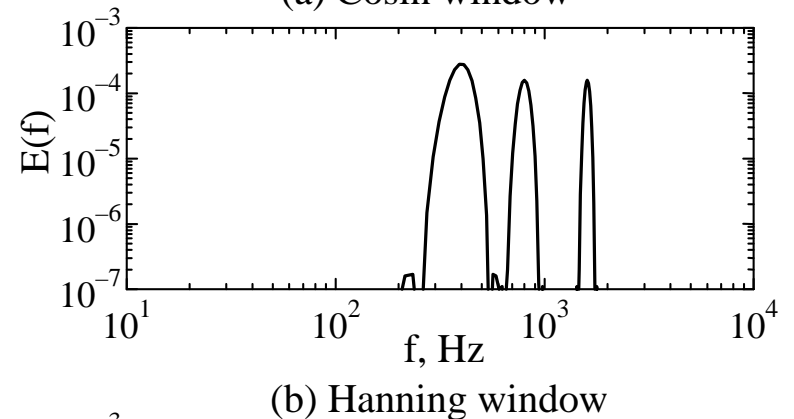
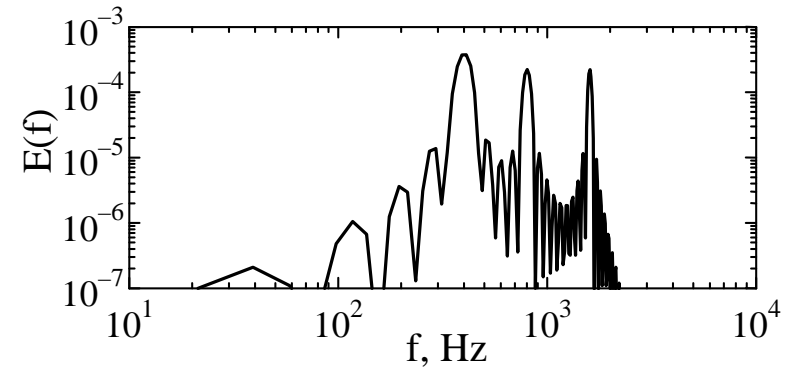
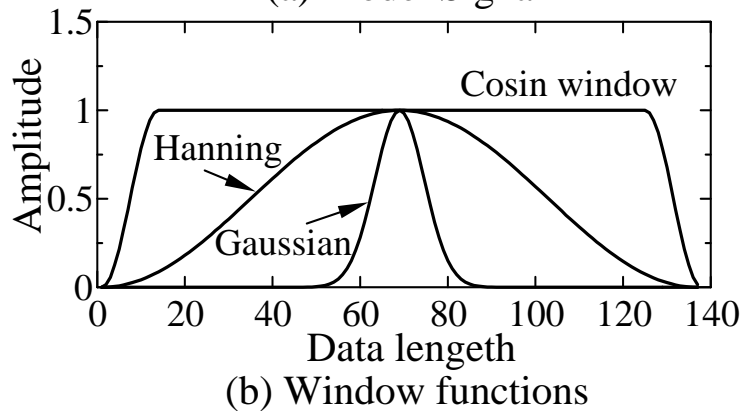
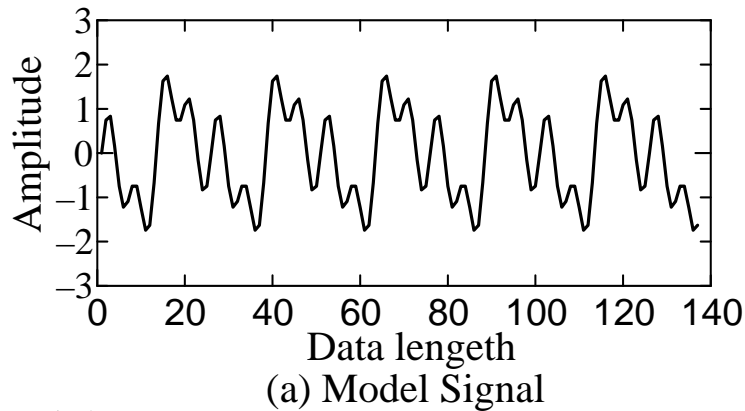
(b) Made by Hanning window



(c) Made by Gaussian function

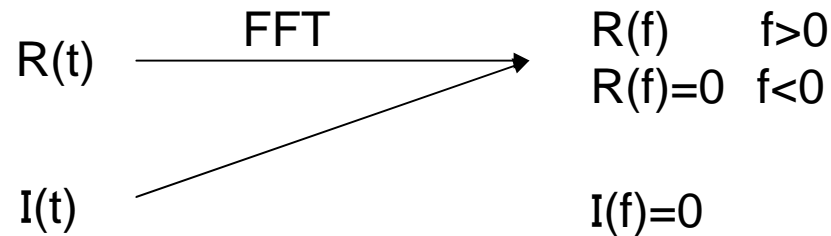


# Spectrum of the RMW

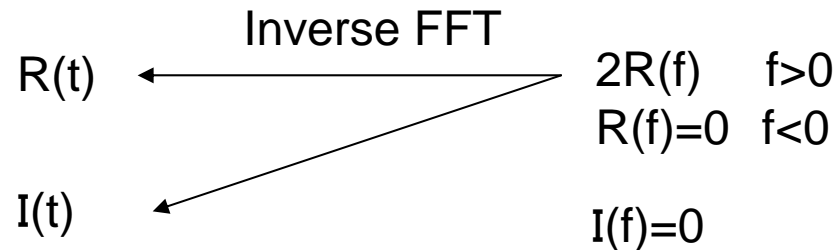


### 3) Construction of a complex RMW

#### 1) Characteristic of Fourier transform:

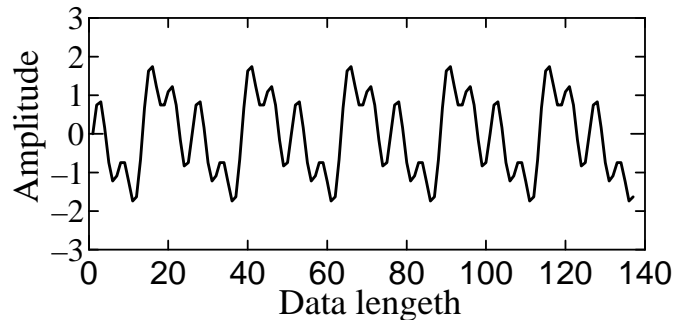


#### 2) Constructing complex RMW using Hilbert transform:

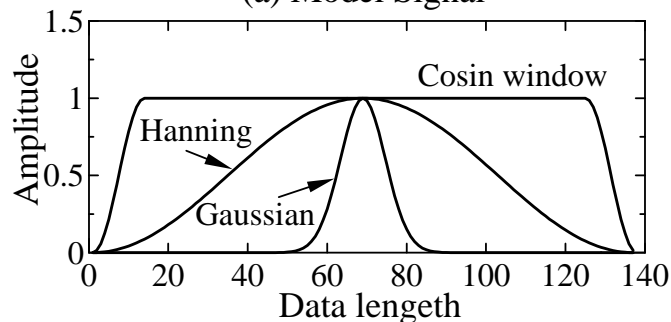


# Example of complex RMW

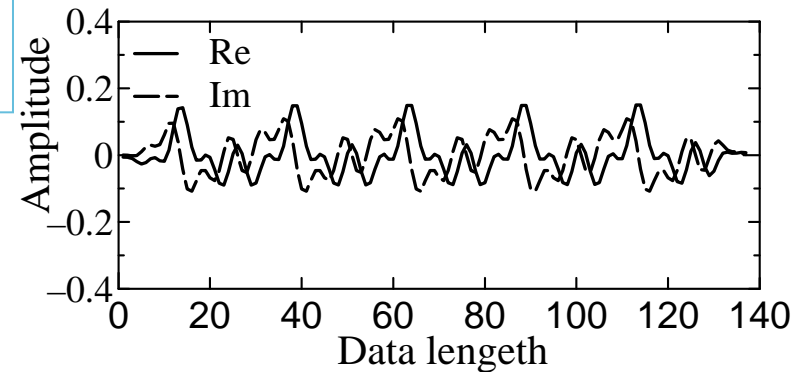
Both Complex and Real RMW have  
Same frequency components



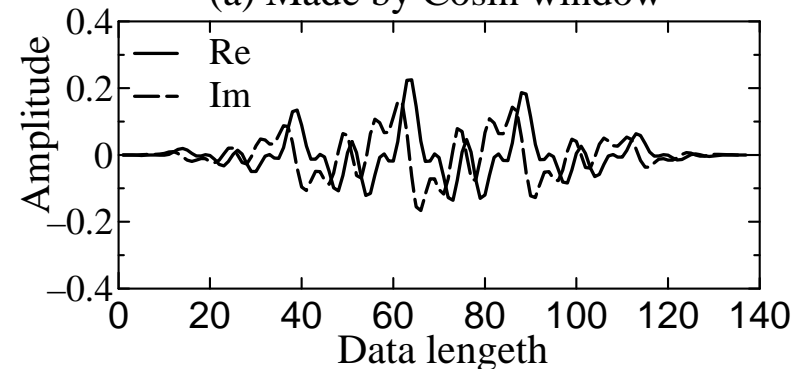
(a) Model Signal



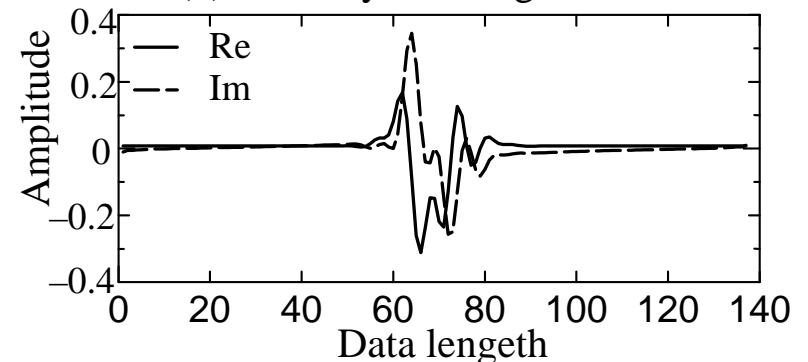
(b) Window functions



(a) Made by Cosin window

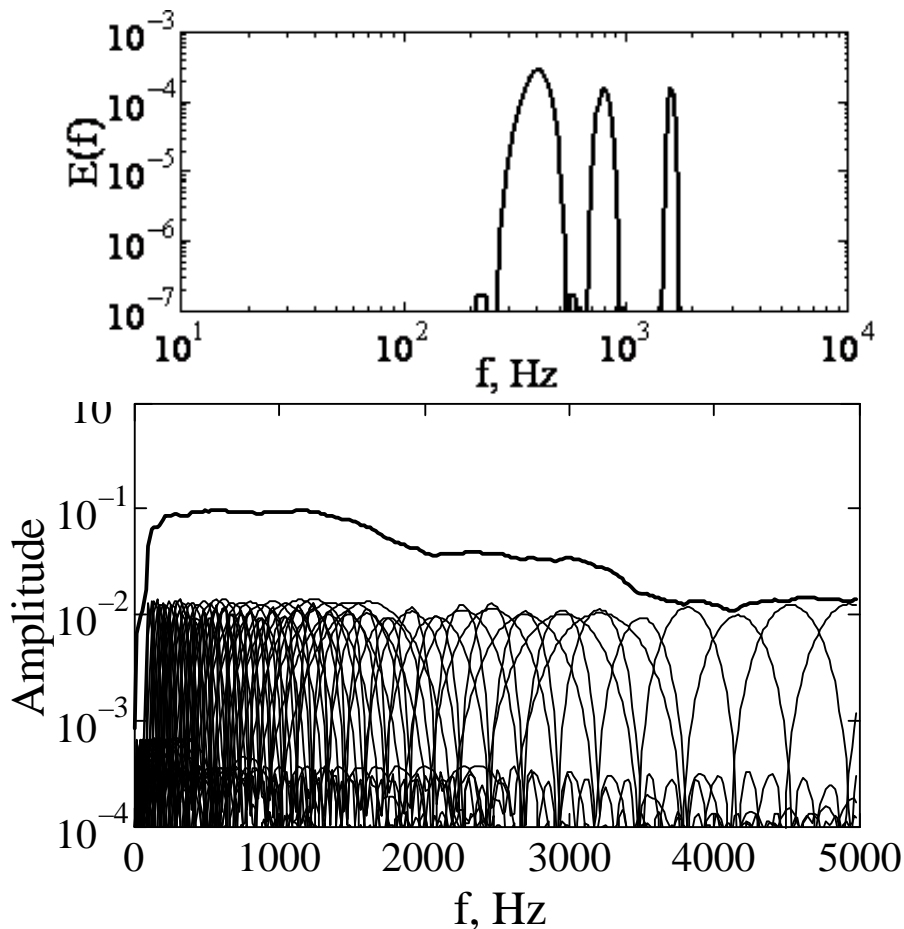


(b) Made by Hanning window

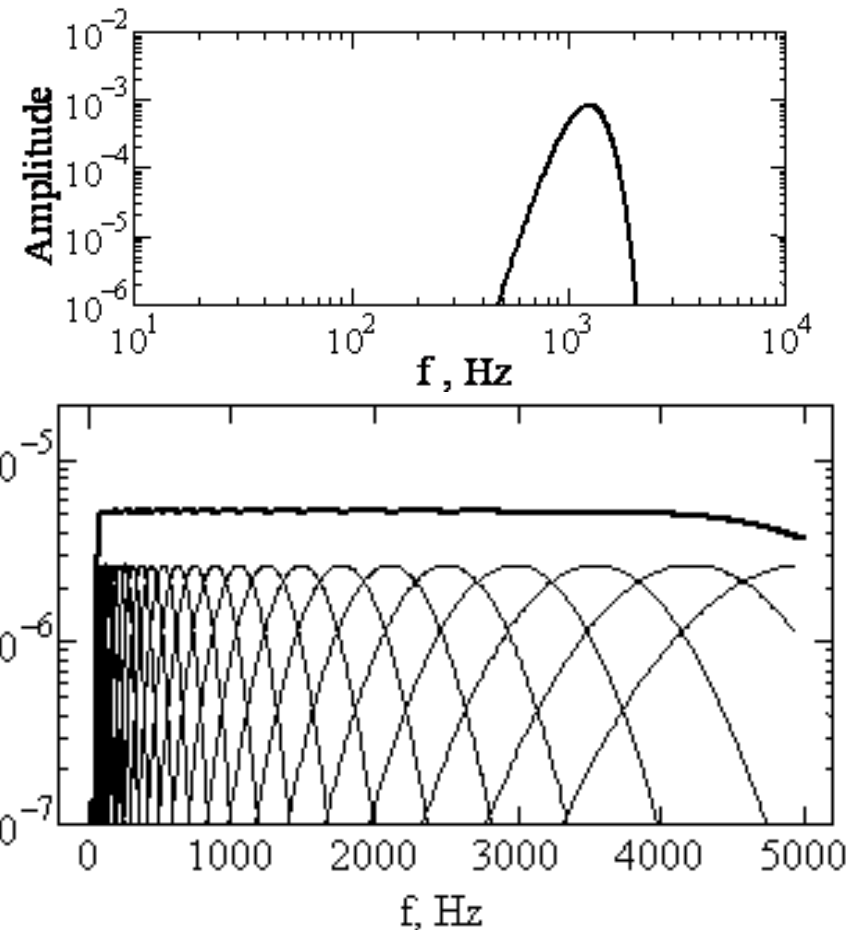


(c) Made by Gaussian function

# Basis of complex RMW



(a) Basis of R-WT for 6 octave, 4 divided



(b) Basis of CWT for 6 octave, 4 divided

But, it isn't problem since our purpose is detection abnormal signal and isn't reconstruct signal.

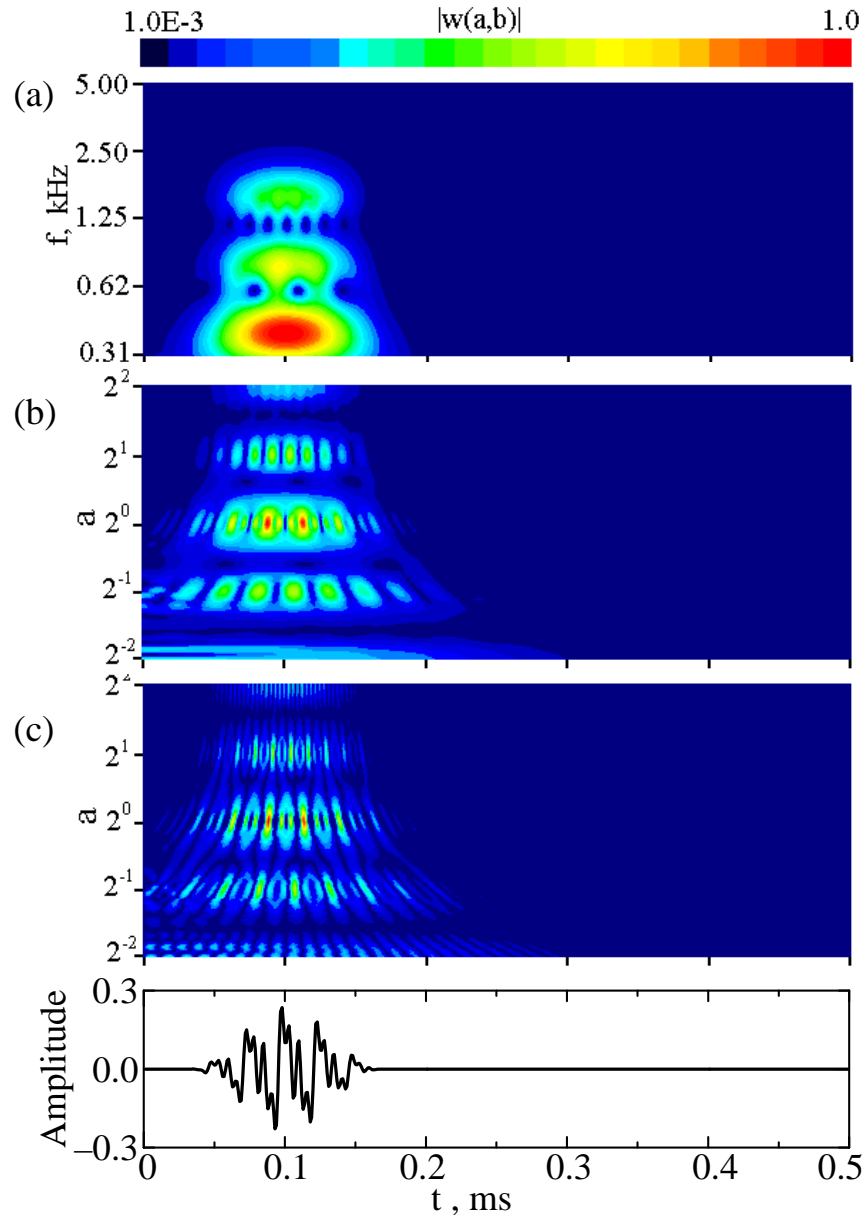
## 4) Example of analysis

### Results:

1) It is clear that three patterns consisting mainly of 400Hz, 800Hz, and 1600Hz were obtained

2) Compared with (a), in (b) and (c), the pattern consisting mainly of scale  $a=1$  and 1ms has appeared strongly.

3) In addition, the differences between (b) and (c) are the striped pattern obtained by the real RMW and continuation pattern obtained by the complex RMW.



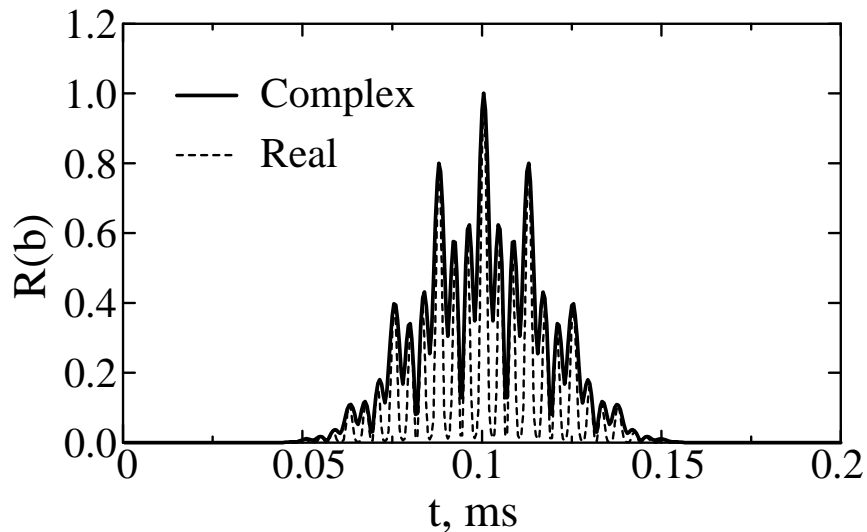
## 6.2 Detection of abnormal signal

### 1) Definition of Wavelet Instantaneous Correlation

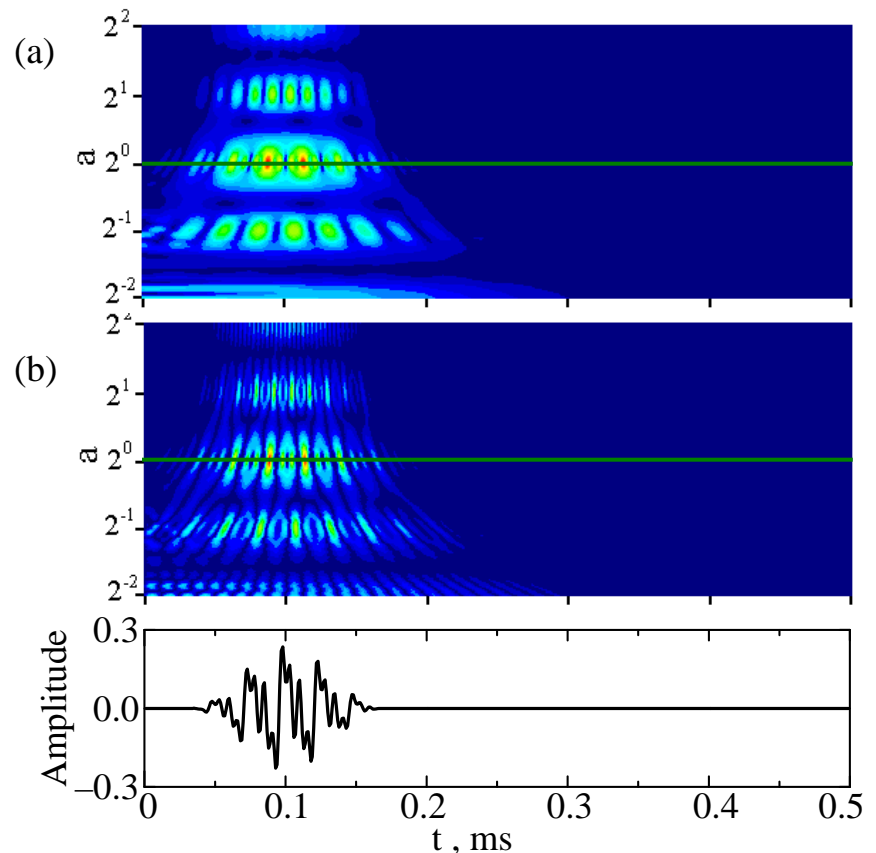
The value  $|w(a, b)|$  obtained by the RMW in scale  $a=1$  is defined by the Wavelet Instantaneous Correlation (WIC) value  $R(b)$  and is shown as follows:

$$R(b) = W(a = 1, b)$$

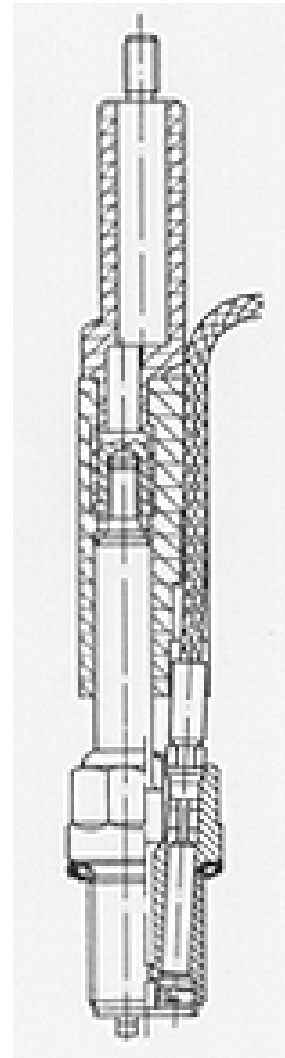
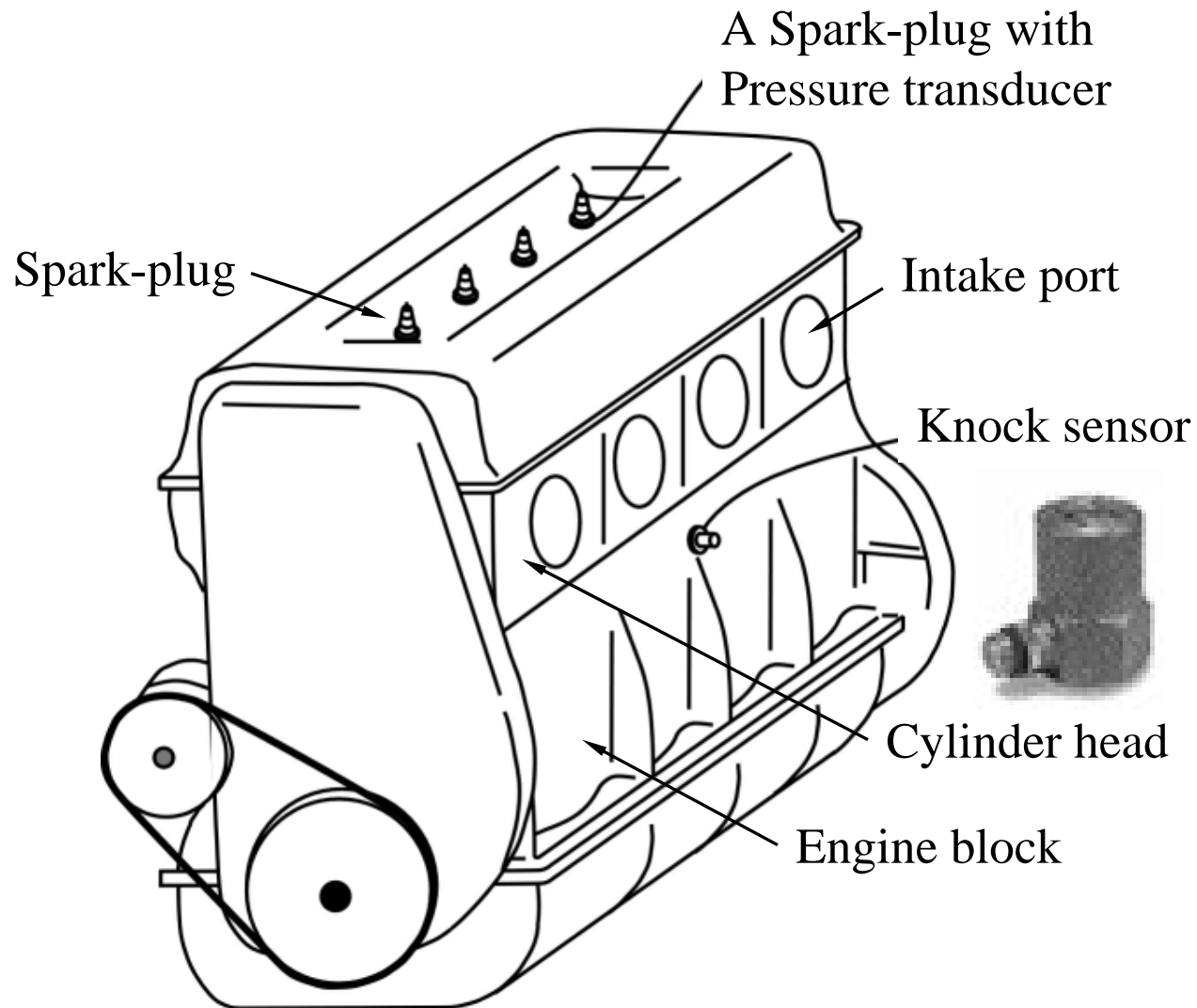
## 2) Example of the WIC



- 1)  $R(b) = 1.0$  can be obtained in 0.1 ms since the RMW is completely the same as the components of the signal.
- 2) The  $R(b)$  using real RMW has an oscillating phenomenon, this phenomenon can be improved by using the complex RMW.



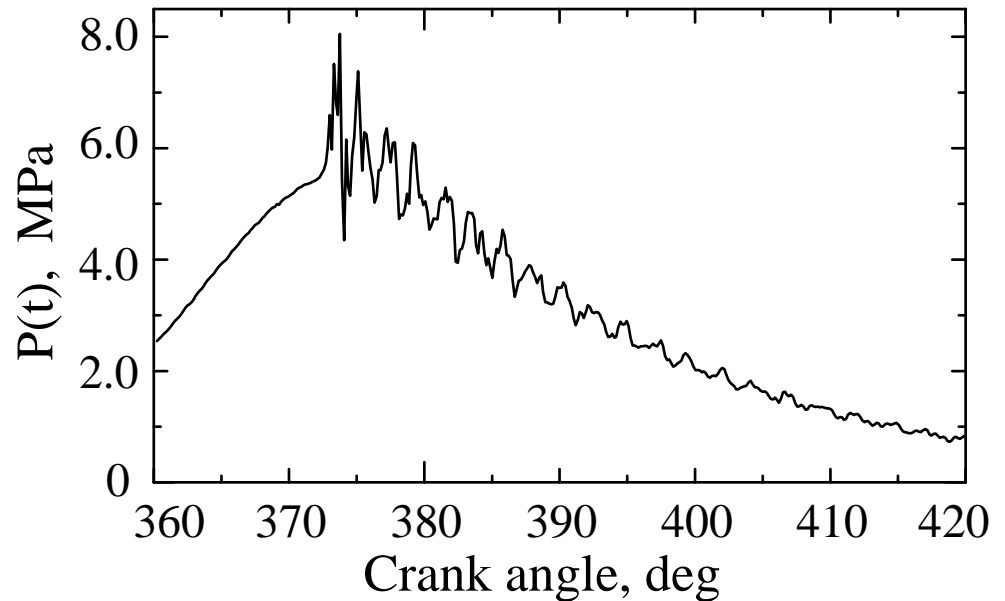
### 3) Knocking extraction from block vibration



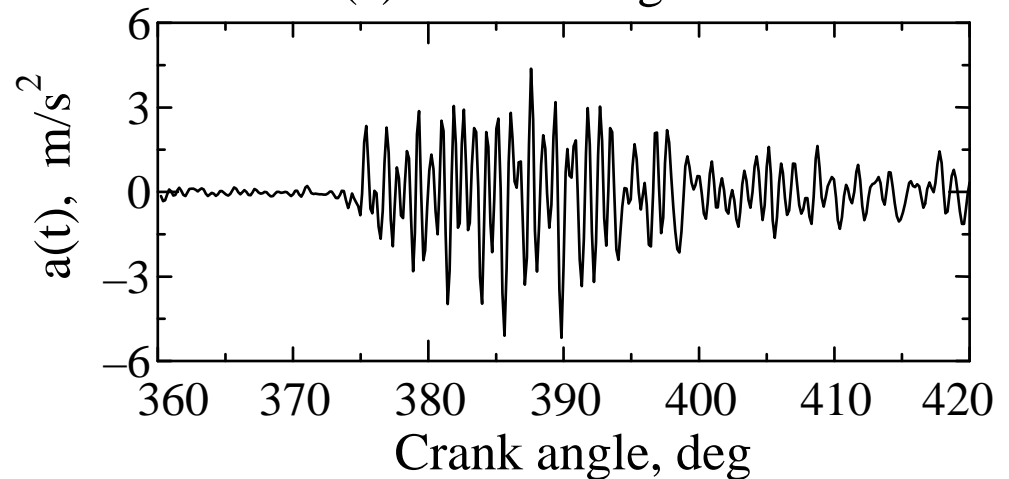


## Example of signal

When a knock occurs, there is corresponding vibration of the pressure and vibration of the engine block.

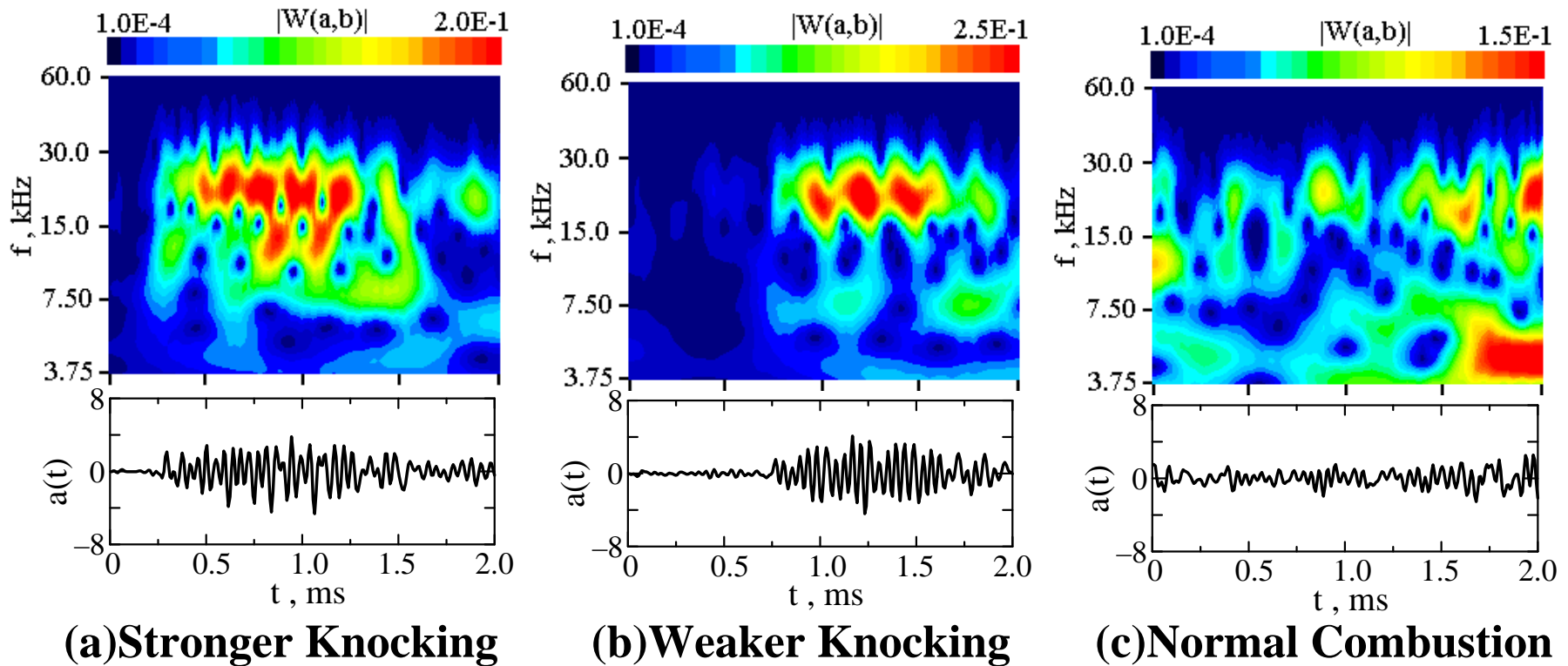


(a) Pressure signal



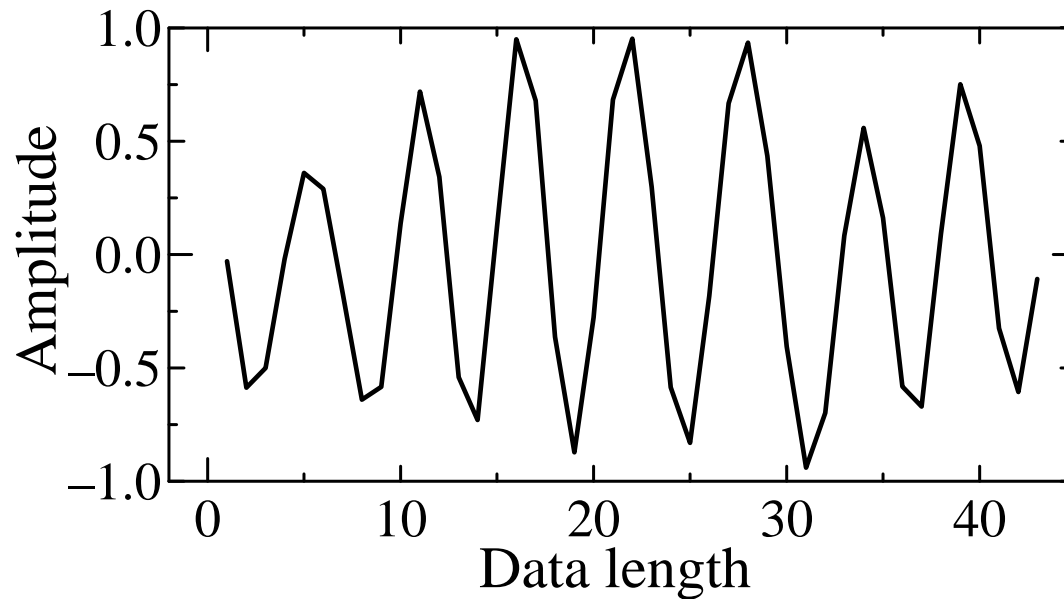
(b) Vibration signal

# Wavelet Transform of the vibration signals



**Fig.4 Wavelet Transform of the vibration signals  
by knock sensor at 3000rpm**

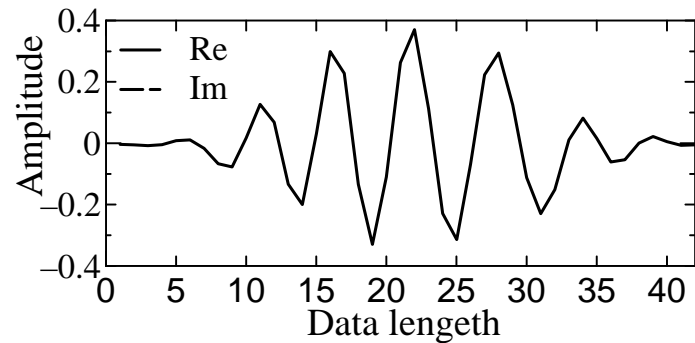
## Portion of vibration



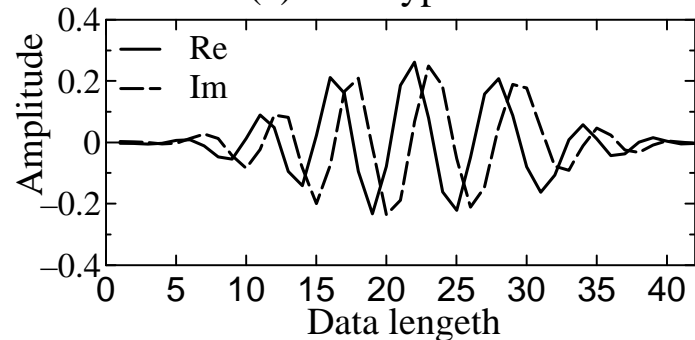
Extracting portion of vibration signal obtained in the condition of Weaker knocking

## Constructing RMW

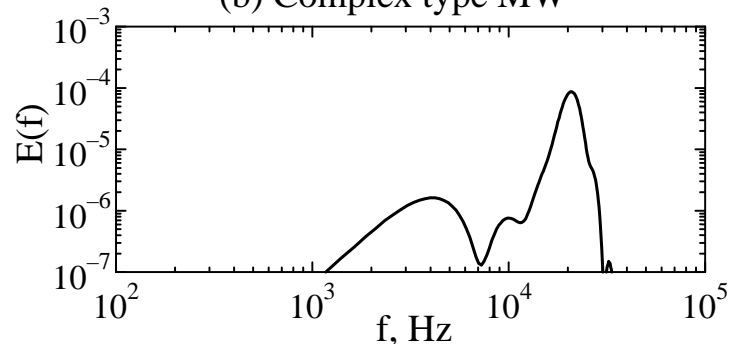
- 1) Multiplying the real signal with Hanning window function and removing the average value.
- 2) Carrying out Hilbert transform of real RMW and obtaining complex RMW



(a) Real type MW

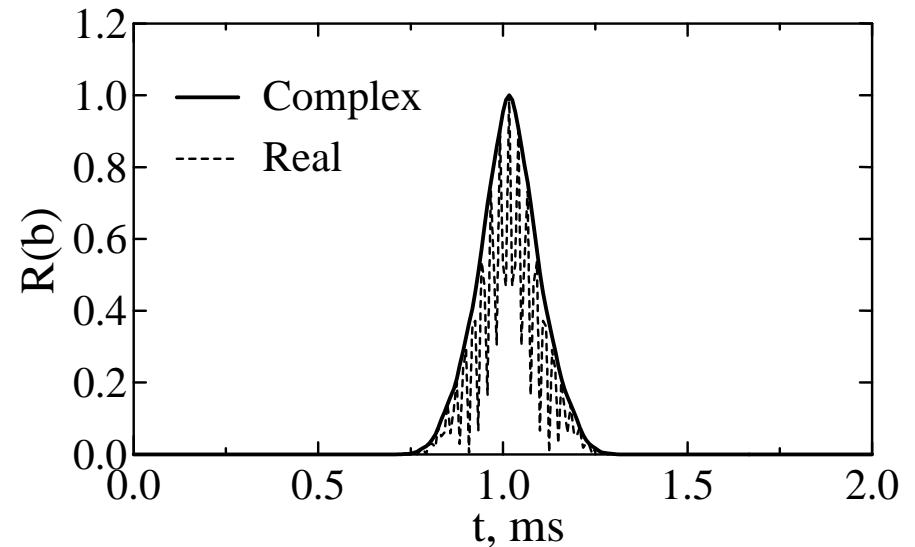
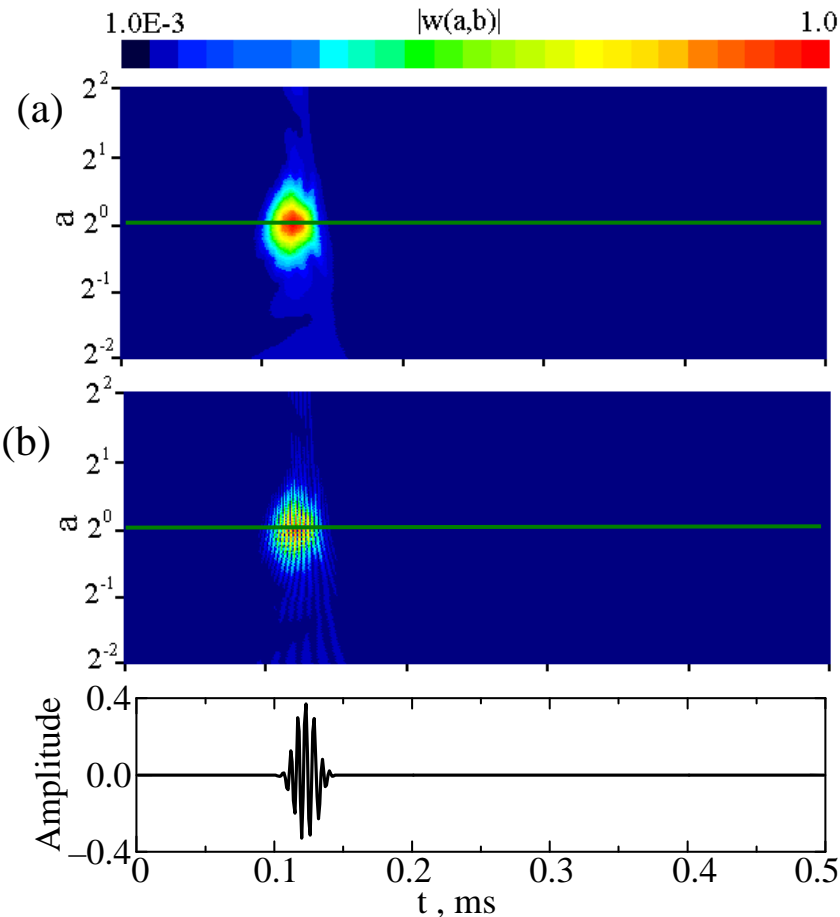


(b) Complex type MW



(c) Power spectrum of MW

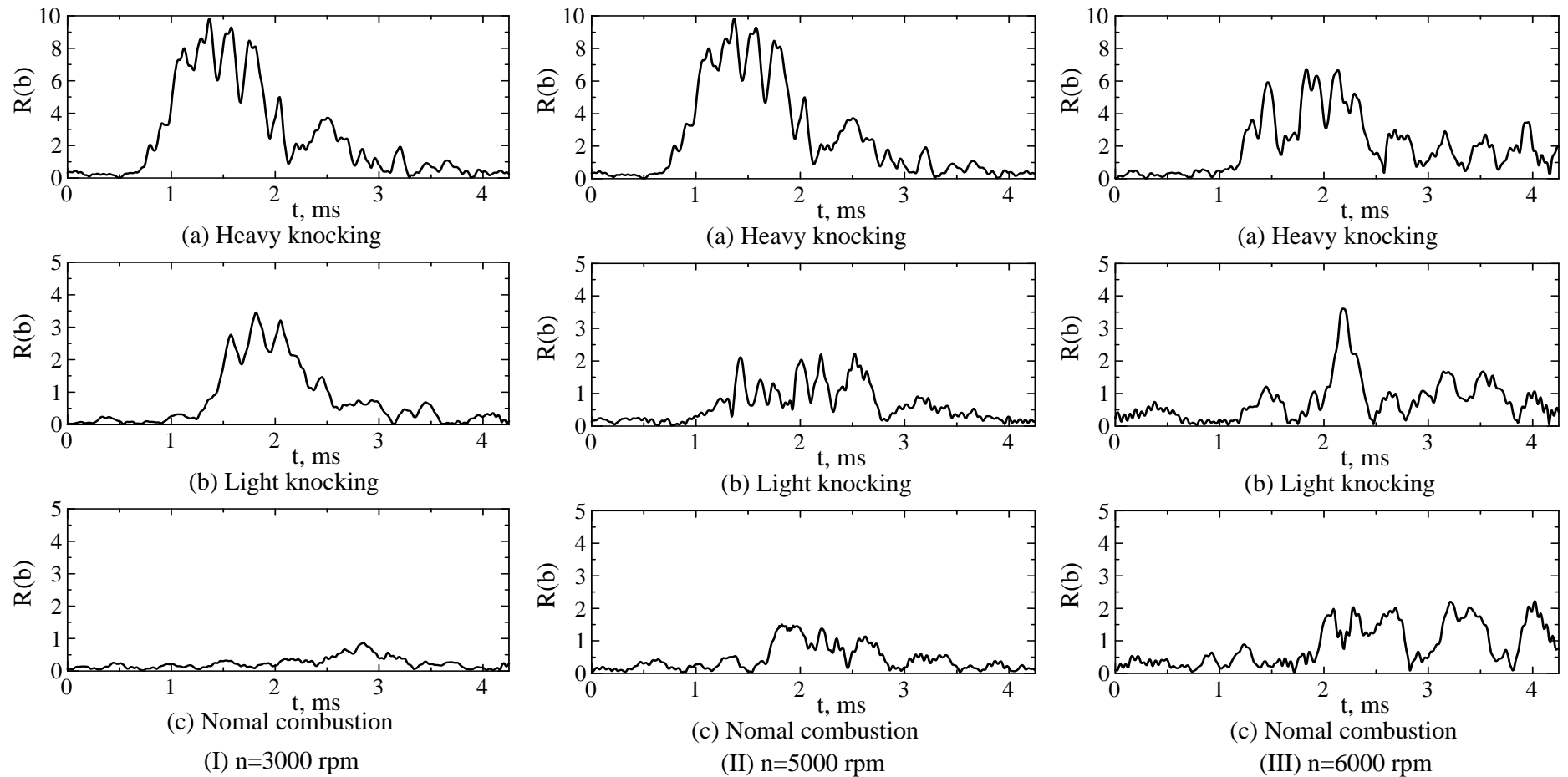
# Example of the WIC



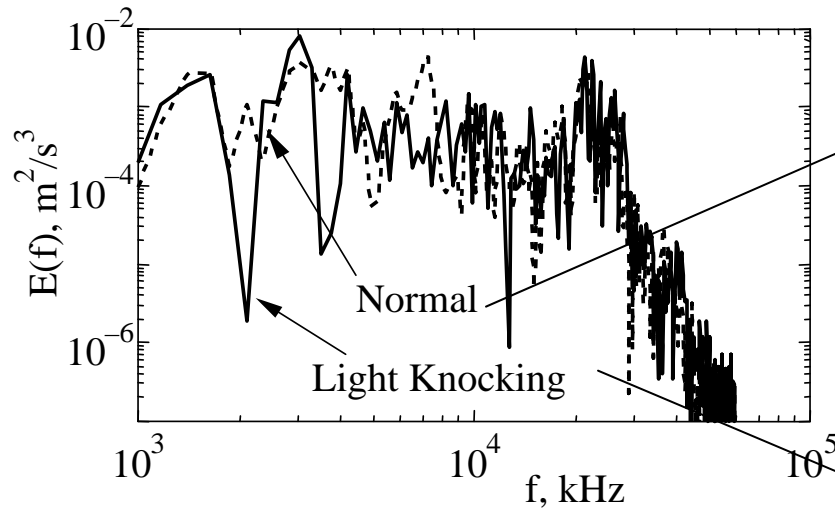
1)  $R(b) = 1.0$  can be obtained in 1.2ms since the RMW is completely the same as the components of the signal.

2) the  $R(b)$  using real RMW has an oscillating phenomenon, this phenomenon can be improved by using the complex RMW.

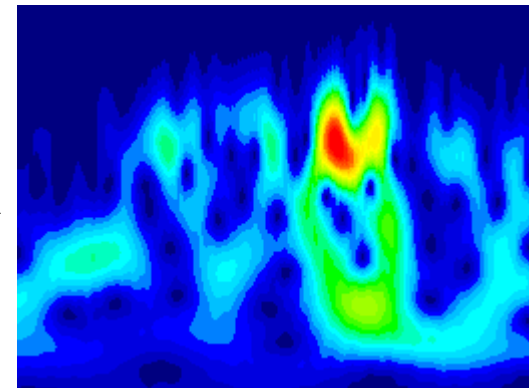
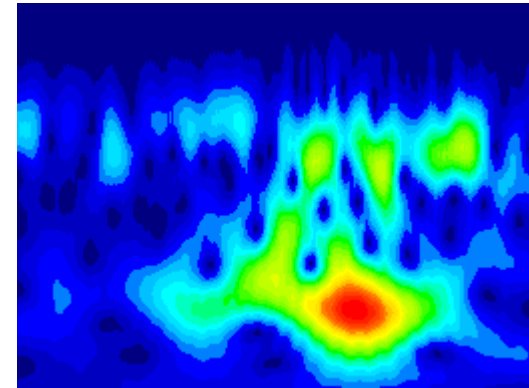
# Example of Knocking Extraction



# Comparing Spectrum

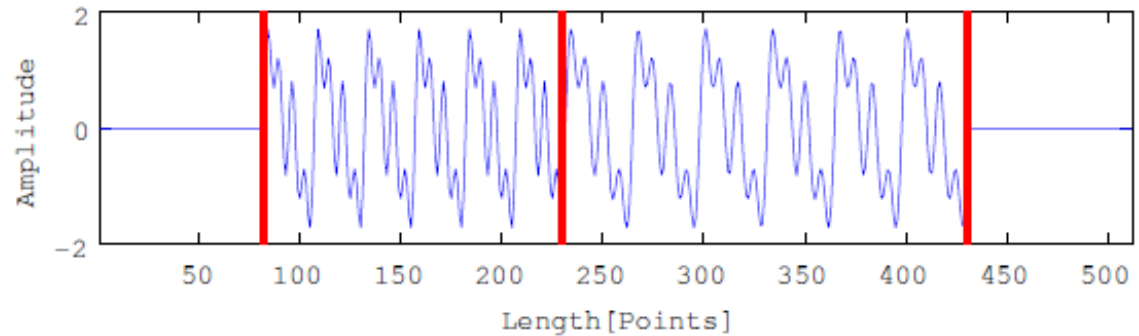


Fourier transform

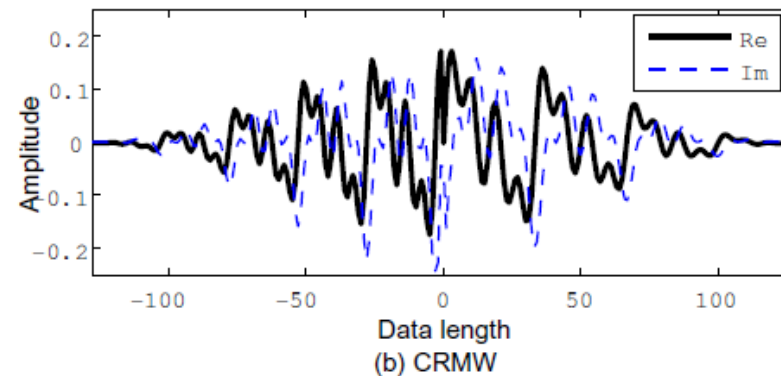
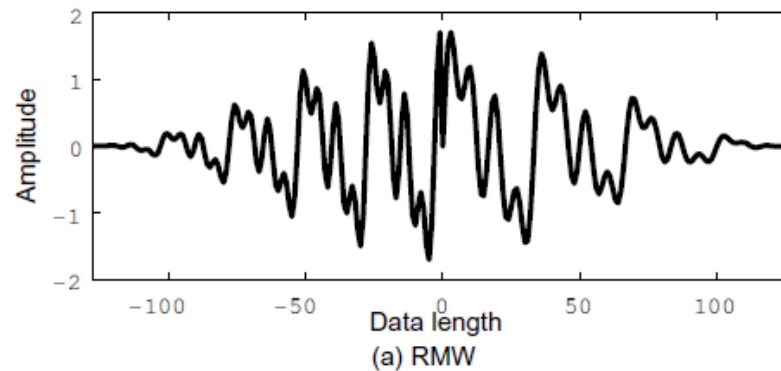


Wavelet Transform

## 6.3 Construction of RMW using more than two signal

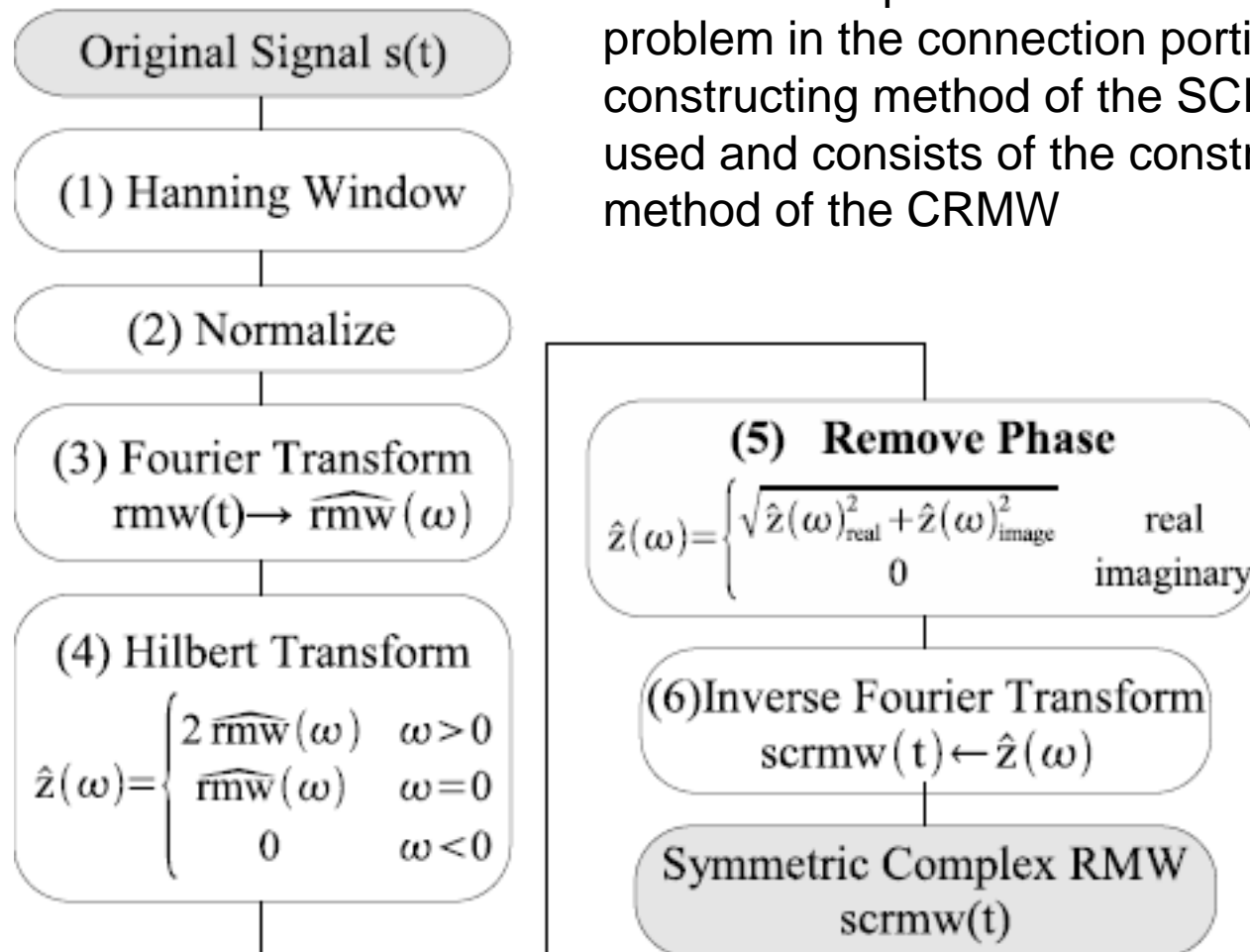


The average characteristic of the two signals can not be obtained from the average CMRW since using the construction method of CRMW, the phase information of the two signals were held and a discontinuity arose in the connection portion.



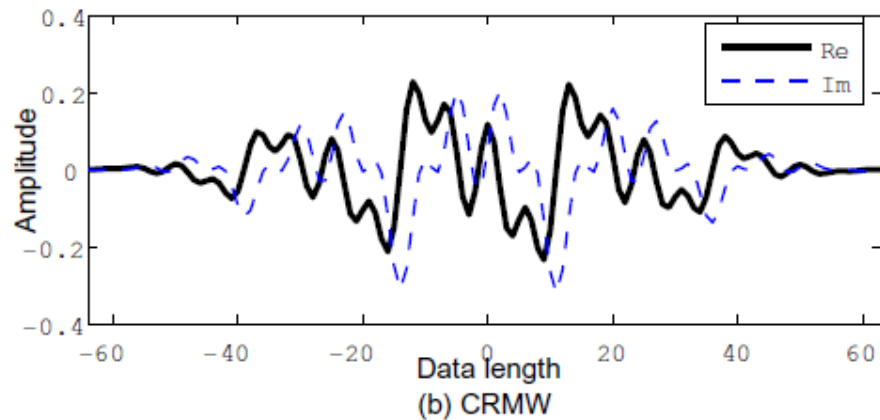
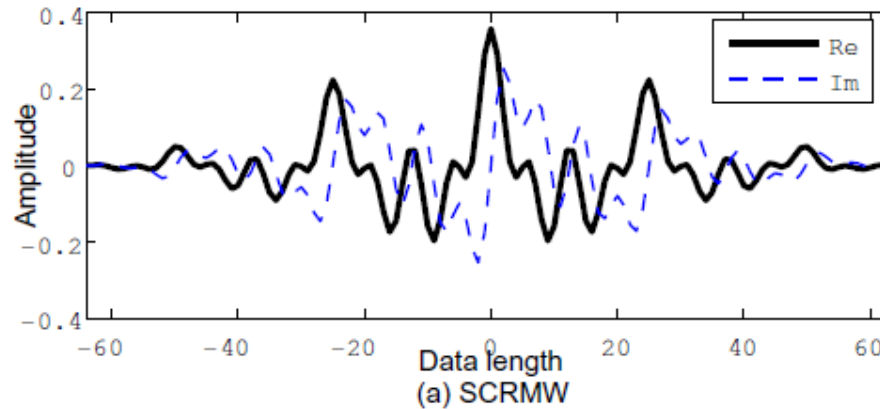


# 1) Flow chart of SCRMW construction



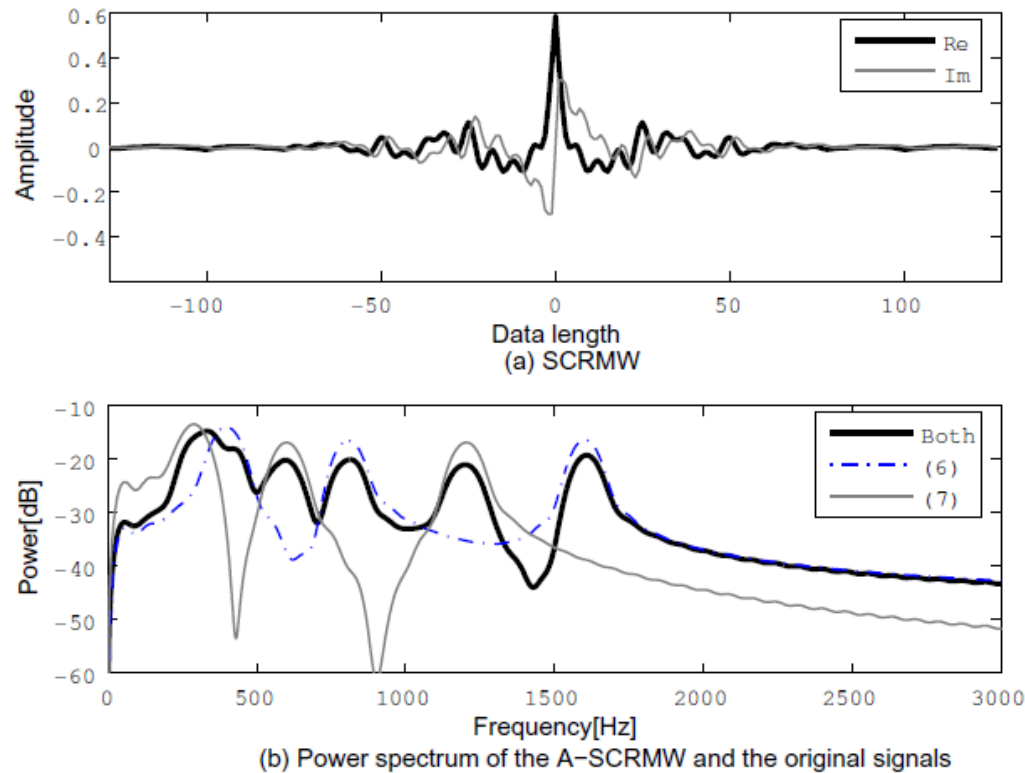
In order to improve the discontinuity problem in the connection portion, the constructing method of the SCRMW was used and consists of the construction method of the CRMW

## Example of the SCRMW



the energy of the SCRMW is concentrated around the center of the SCRMW. In addition, the real component of the SCRMW has symmetry and the imaginary component has anti-symmetry.

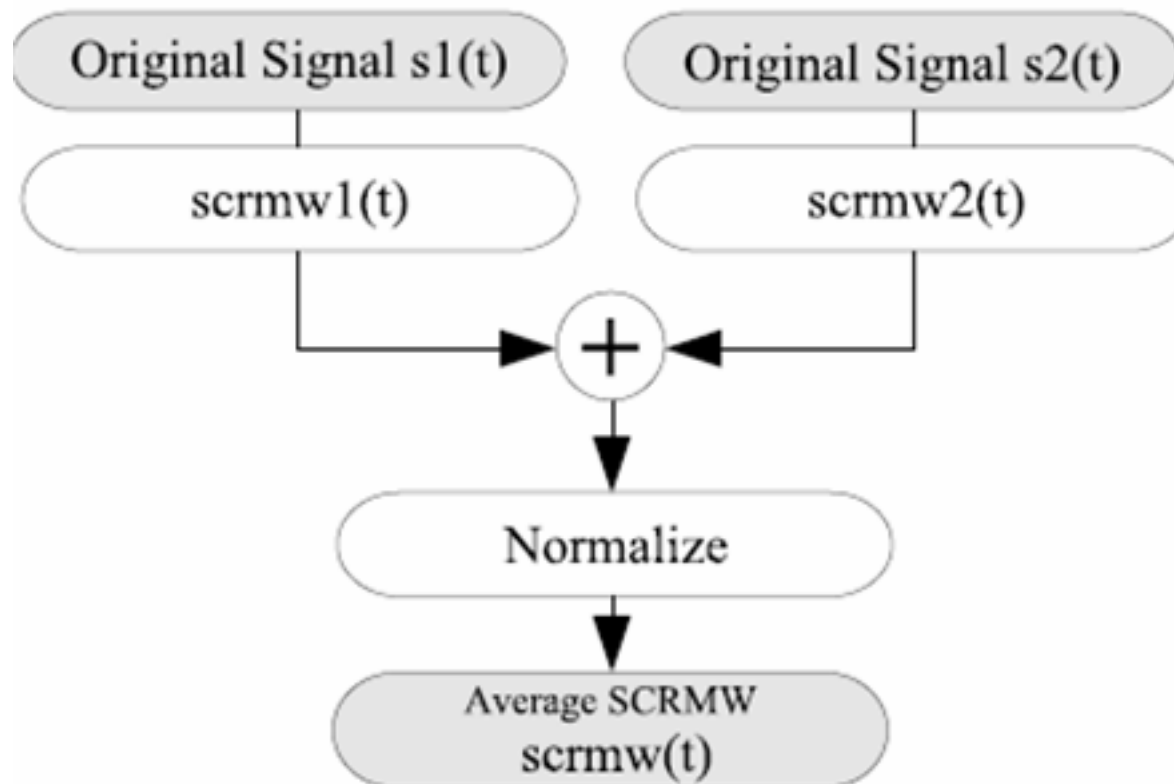
# Example of the average SRMW



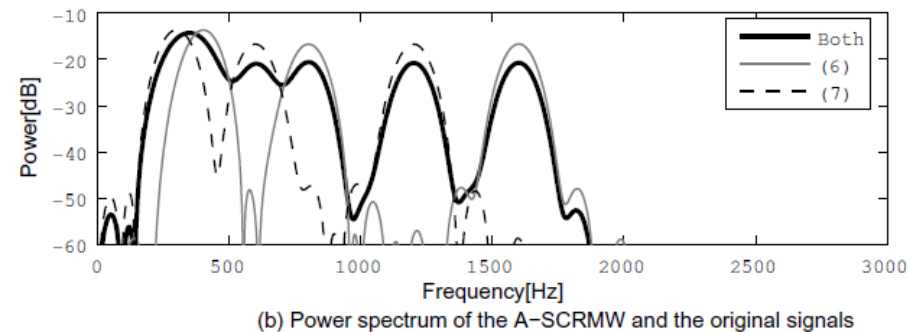
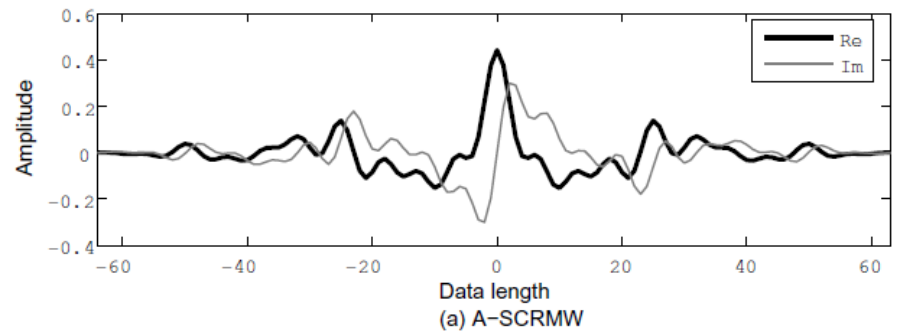
**Result:** the average SCRMW has the SCRMW's property.

**Problem:** the frequency property which high frequency components have been increased is not good because the average RMW has a discontinuous part in the connection portion.

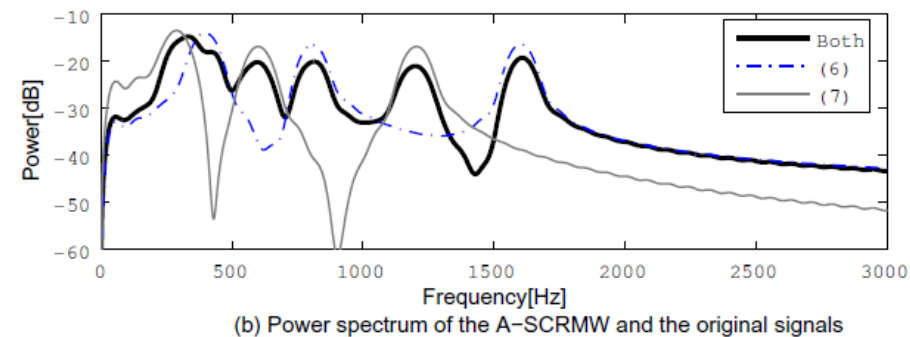
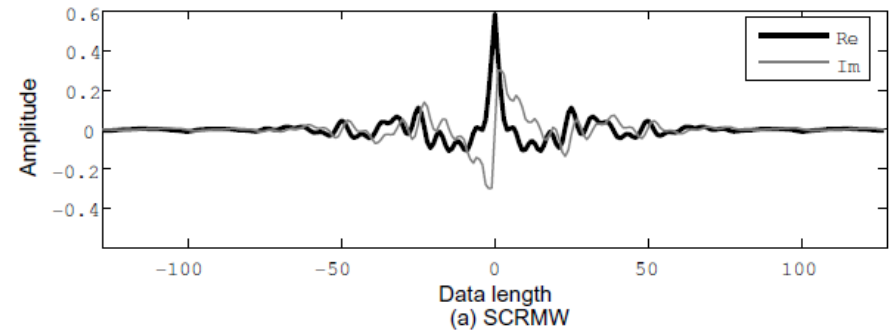
## 2. Construction Method of A-RMW



# Example of the A-RMW



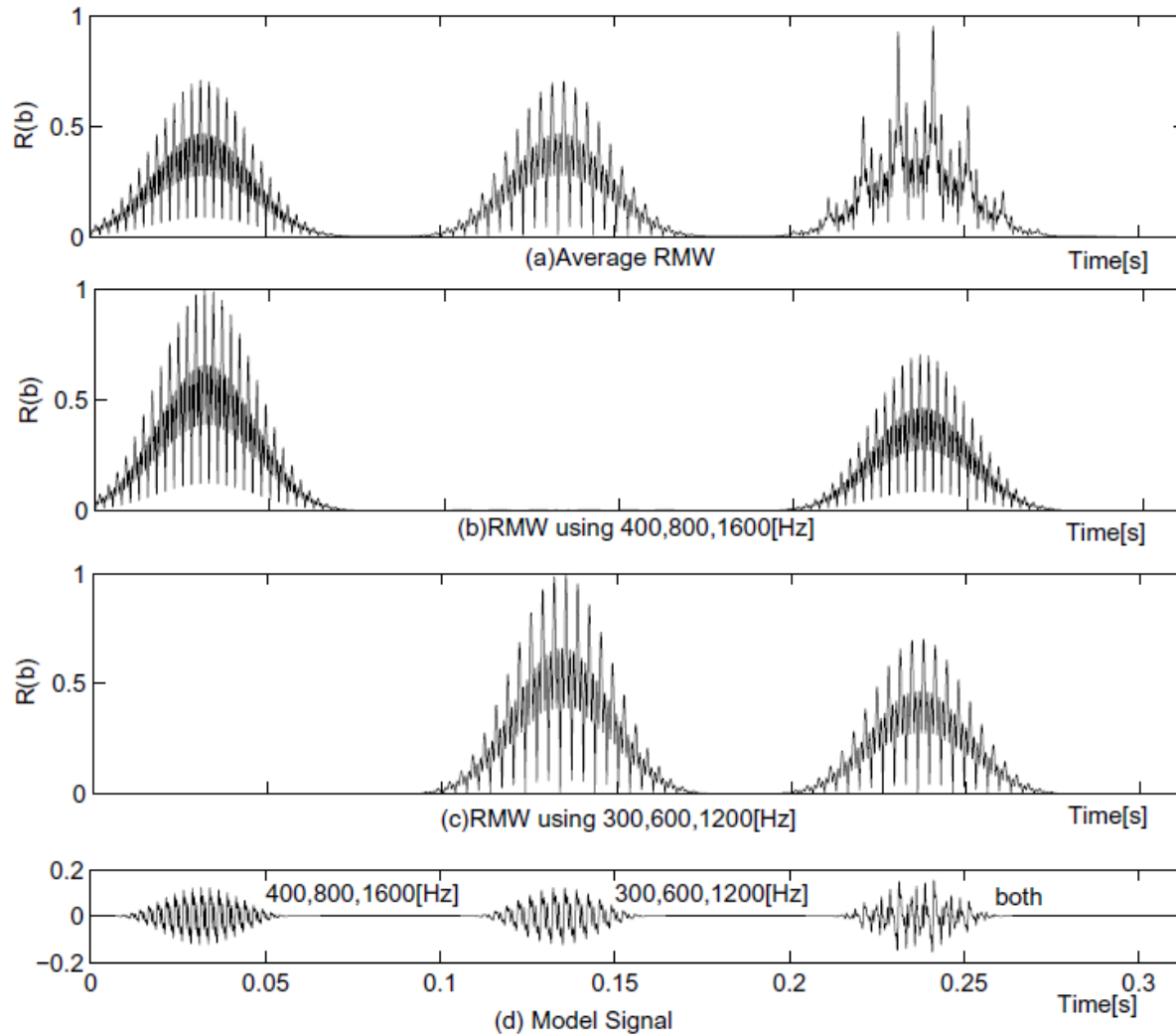
(a) Example of A-RMW



(b) Example of average CRMW

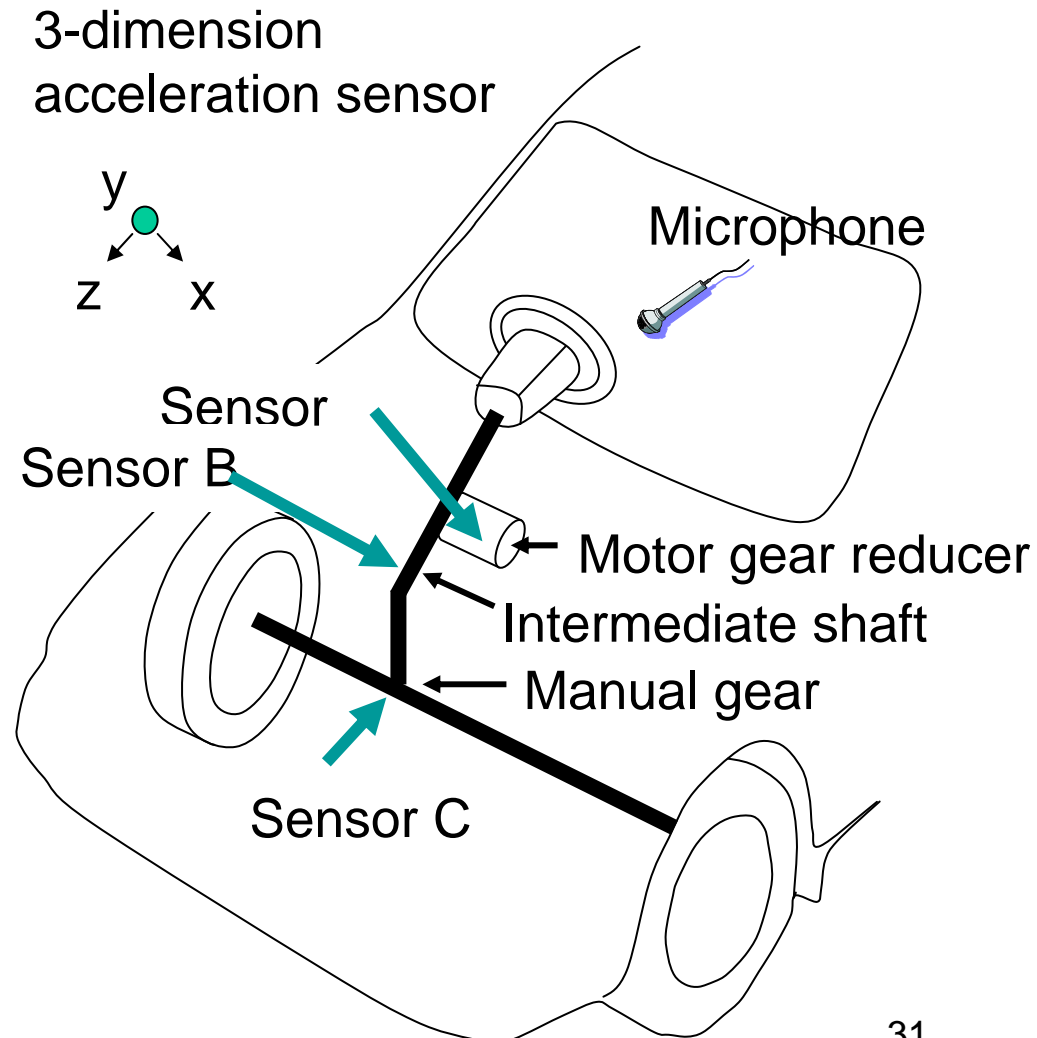
**Result:** the average SCRMW shown in (b), it has some frequency components which the original model signal does not have. However, in the case of the A-RMW, this phenomenon has been improved.

# Detection result obtained by WIC

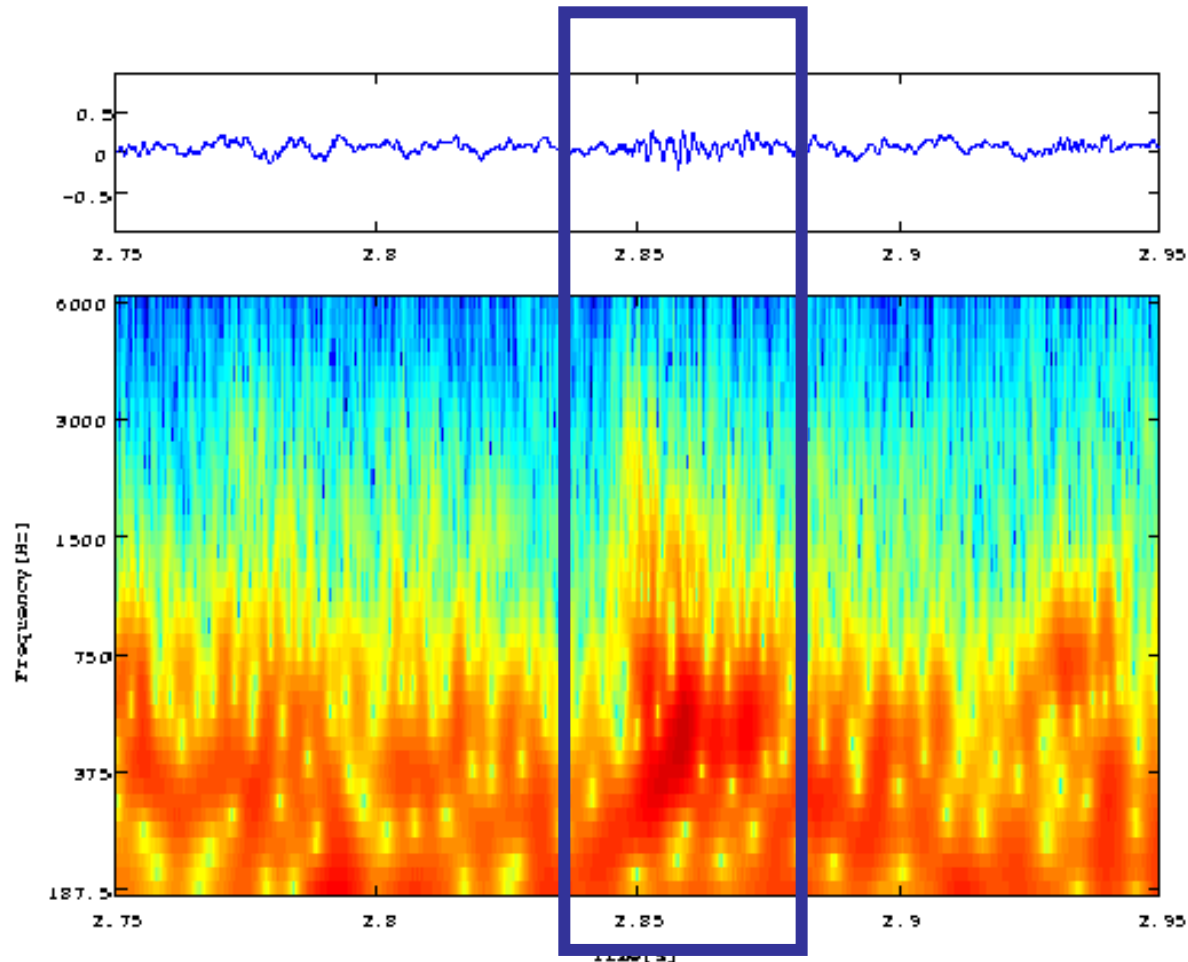


### 3) Rattle Noise Source Detection

- Electric Power Steering (EPS)
- A rattle noise and a joint noise are occurred from EPS system.

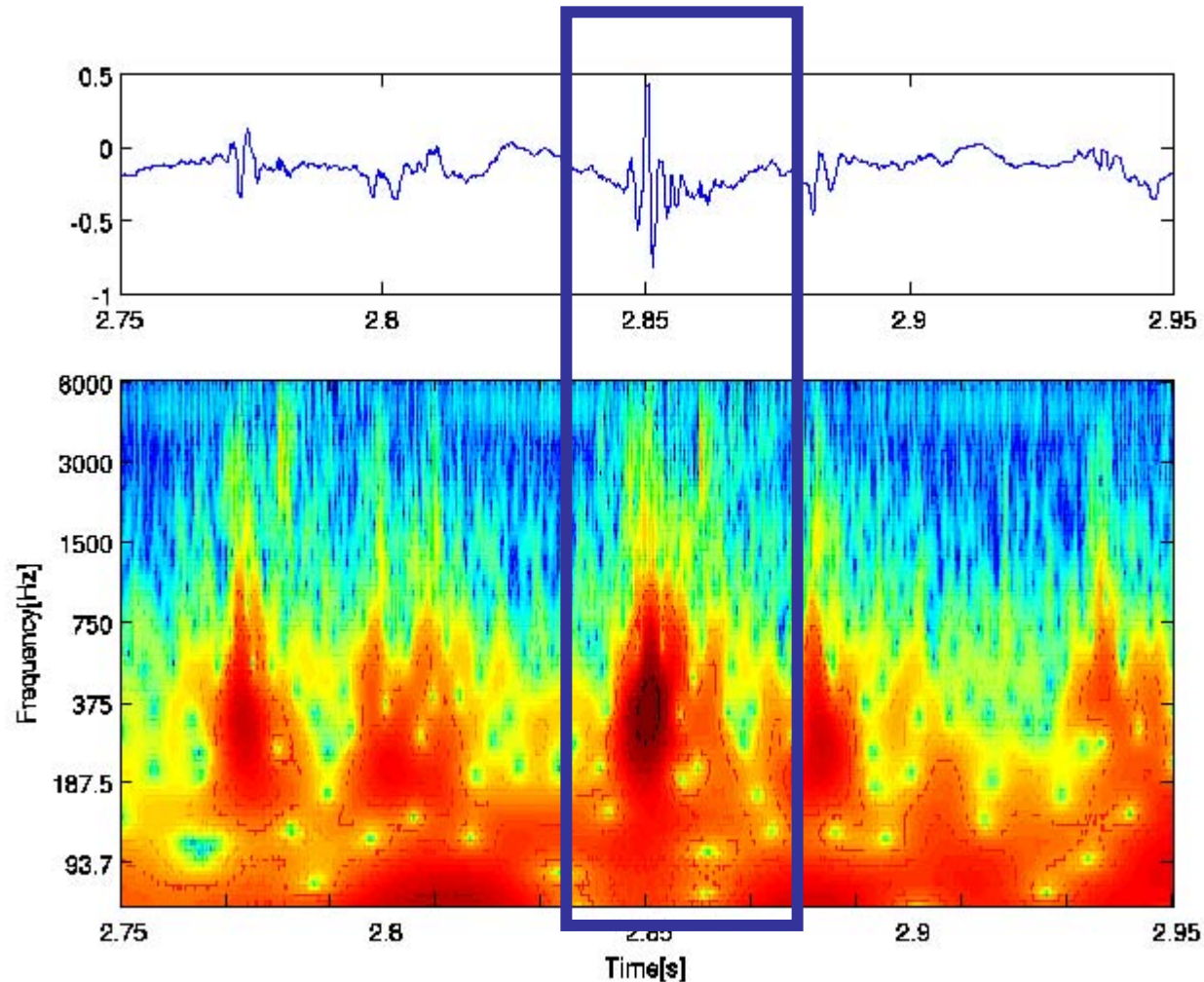


# Example of CWT (Rattle noise)



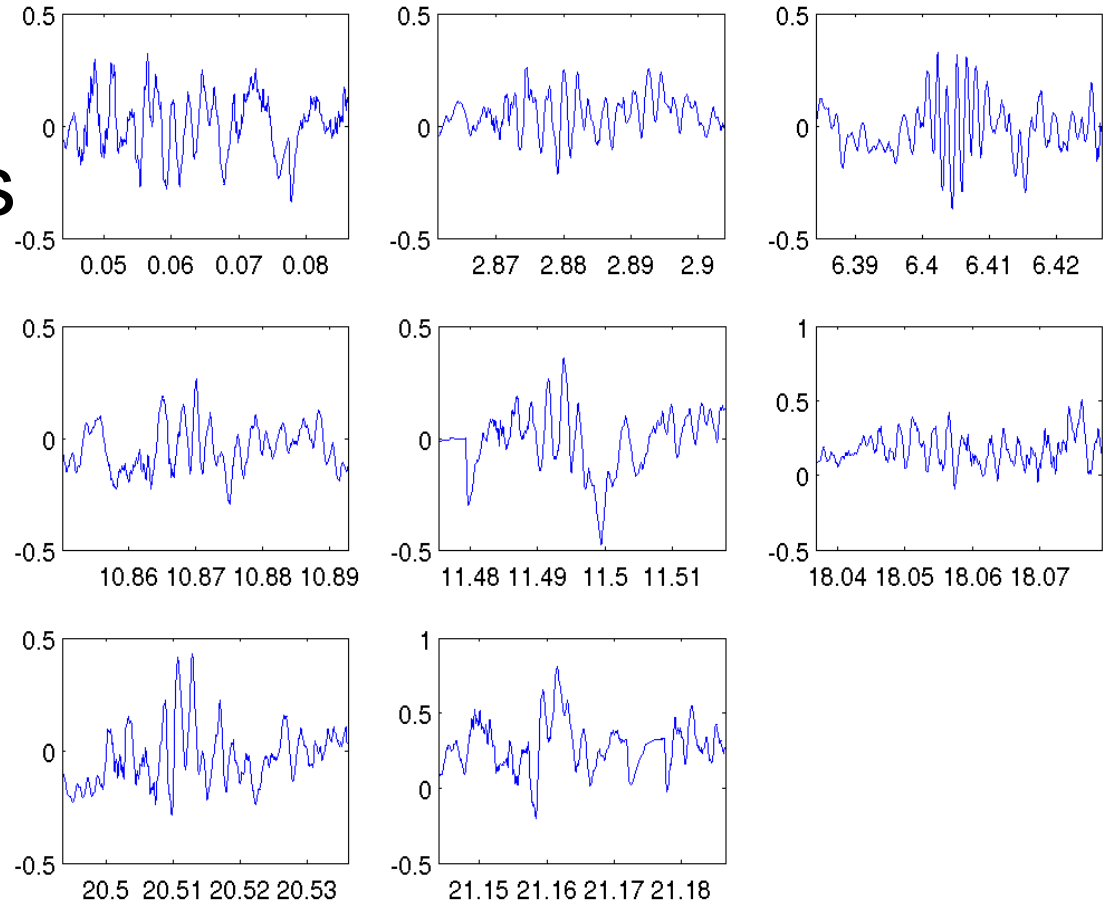


# Example of CWT (Acceleration sensor signal)



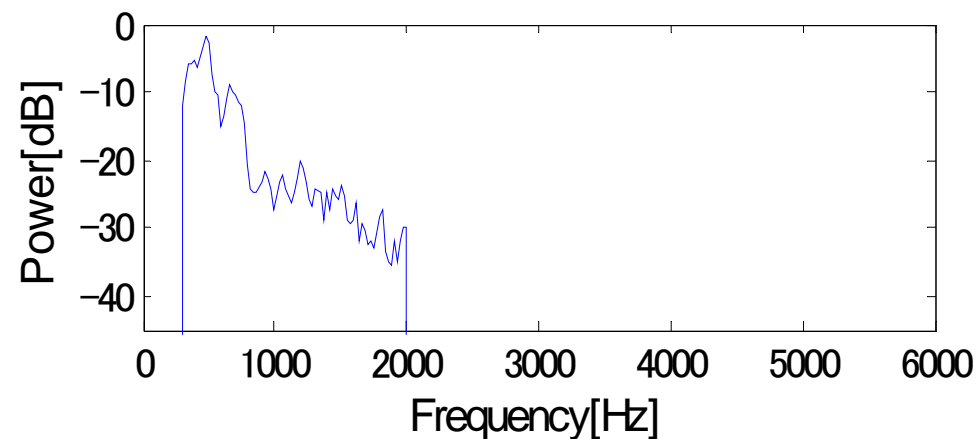
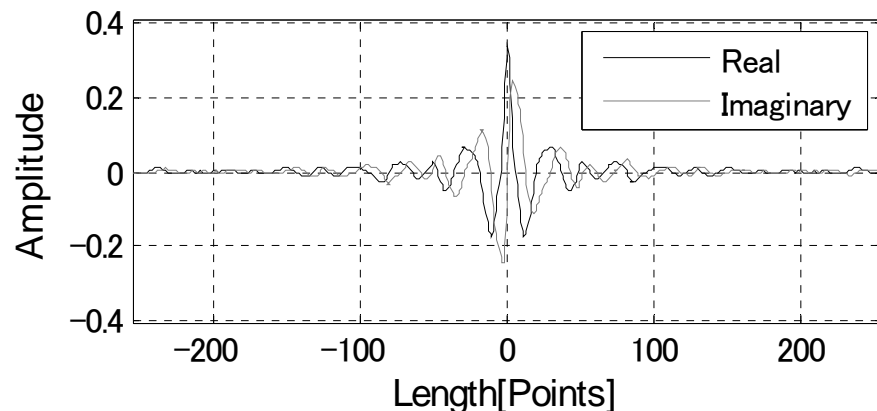
# Constructing A-RMW

- The rattle sound signals picked up by using CWT.
- Construct A-RMW from eight signals.



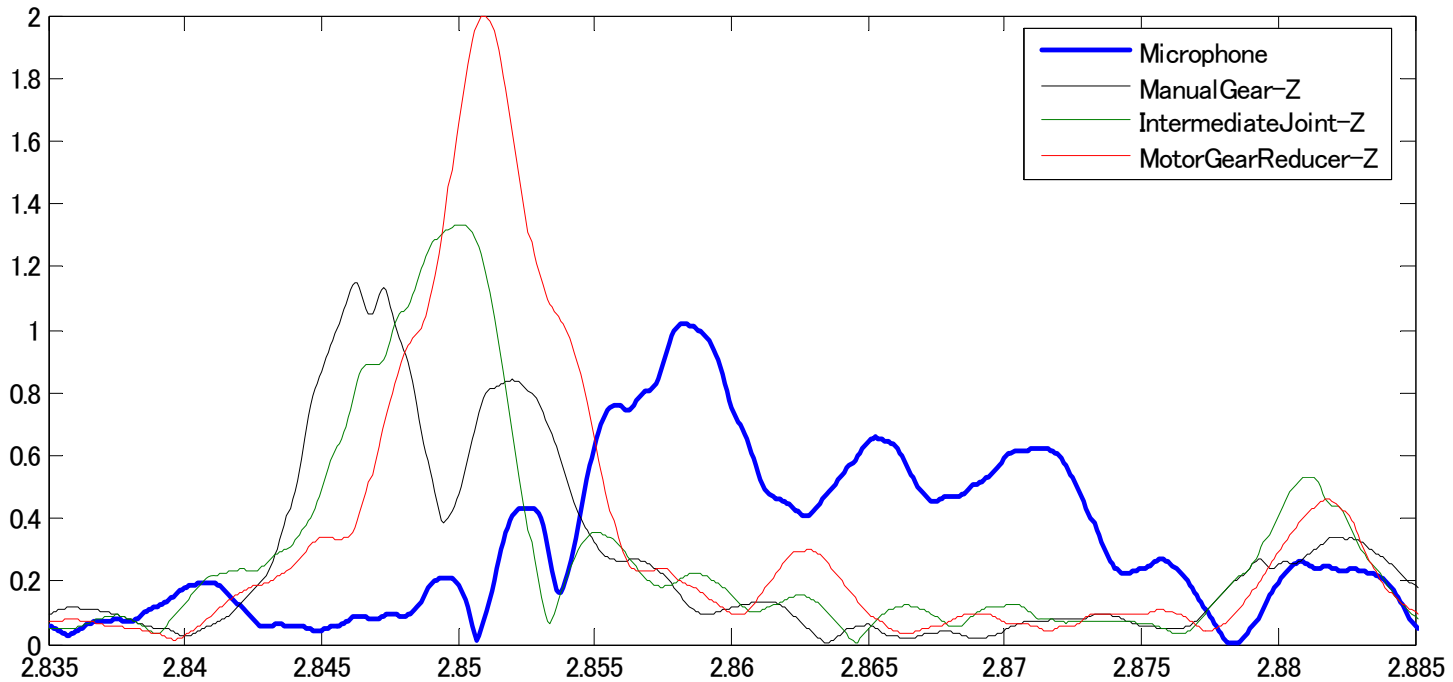
# Constructing A-RMW

- We used band-pass filter.
- Because low frequency sound was very big and inaudibility sound.



# Result of WICV

- Typical result (Z-axis).



## 4) Patient diagnosis by the WIC

- Patient's EEG of Alzheimer's disease (Wavelet Analysis)
- Choose Stable Wave

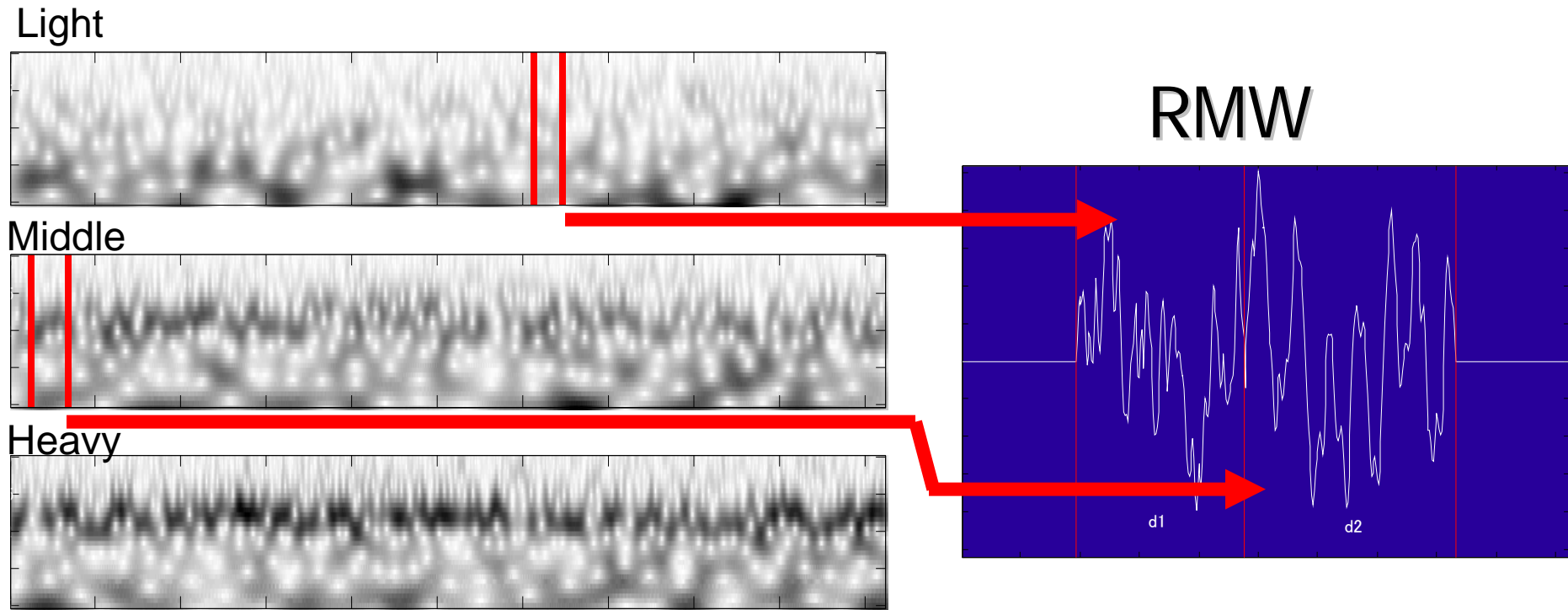
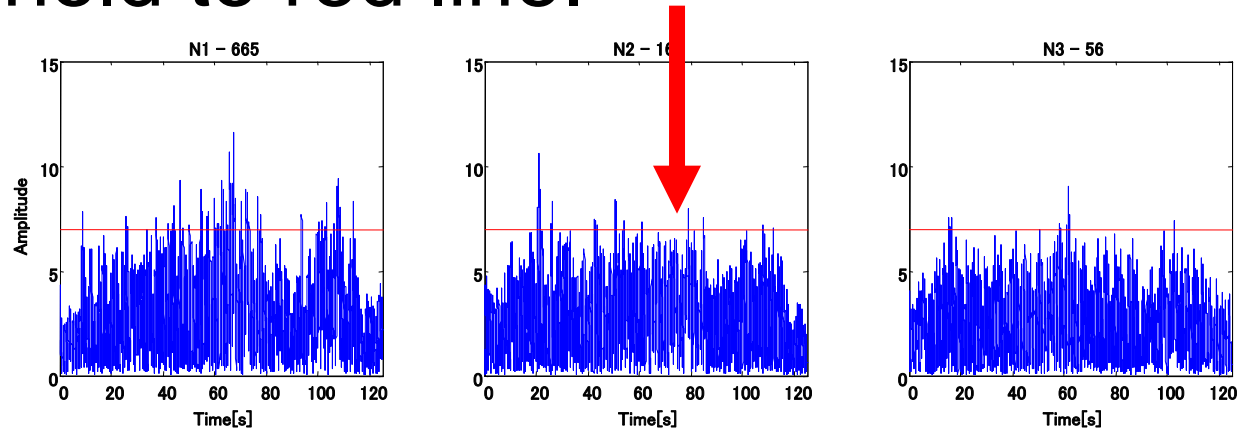


Fig.6 A-RMW constructed from EEG

# Analytical Result

- Only Wavelet Coefficient at Scale 1.
- We set threshold to red line.

Healthy People



The Patients

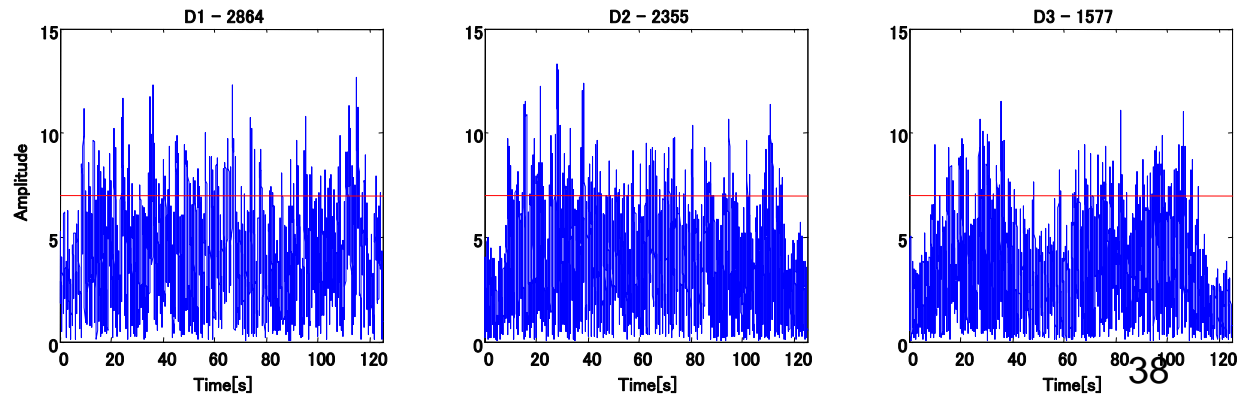


Fig.5 Wavelet Coefficient (Scale 1) using SCRMW

## Analytical Result

- Statistic method
  - Threshold
  - Calc Average
- We could identify senile dementia.

Healthy People

The Patients

	Over the threshold line	Average line
N1	665	3.04
N2	163	2.91
N3	56	2.62
D1	2864	4.27
D2	2355	3.98
D3	1577	3.63

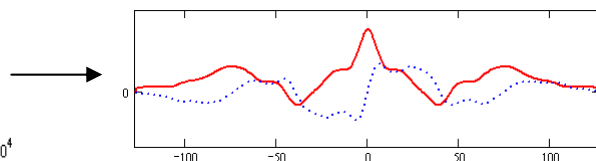
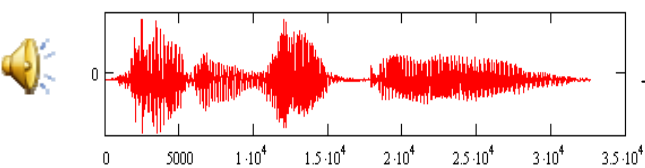
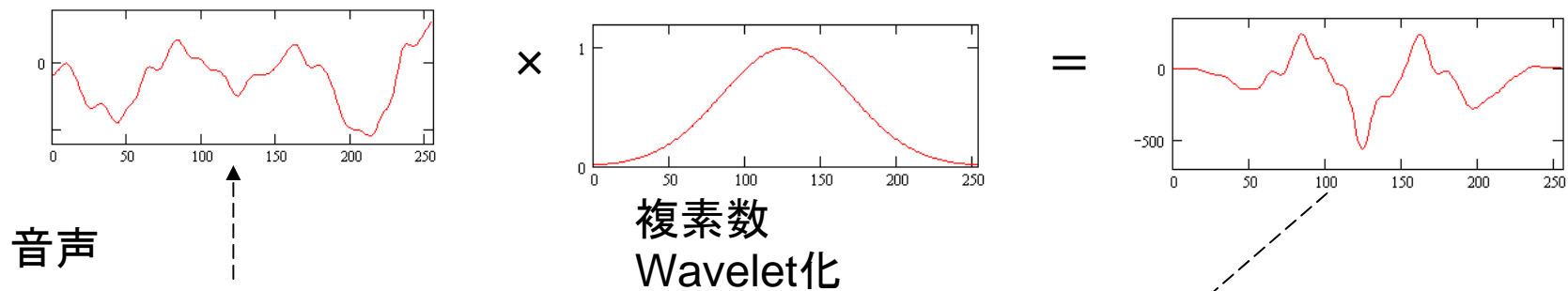
# 5)Sound composition

## Conventional method



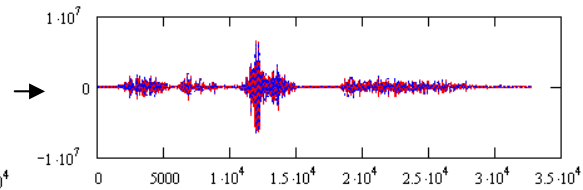
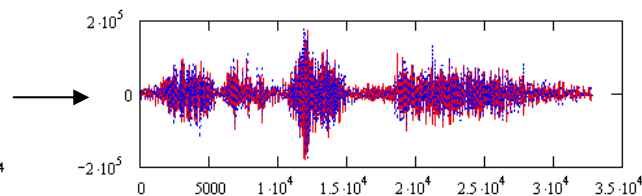
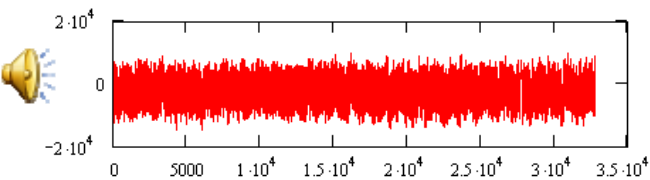


# New method

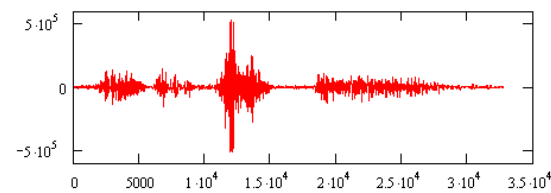


連続Wavelet変換

逆変換



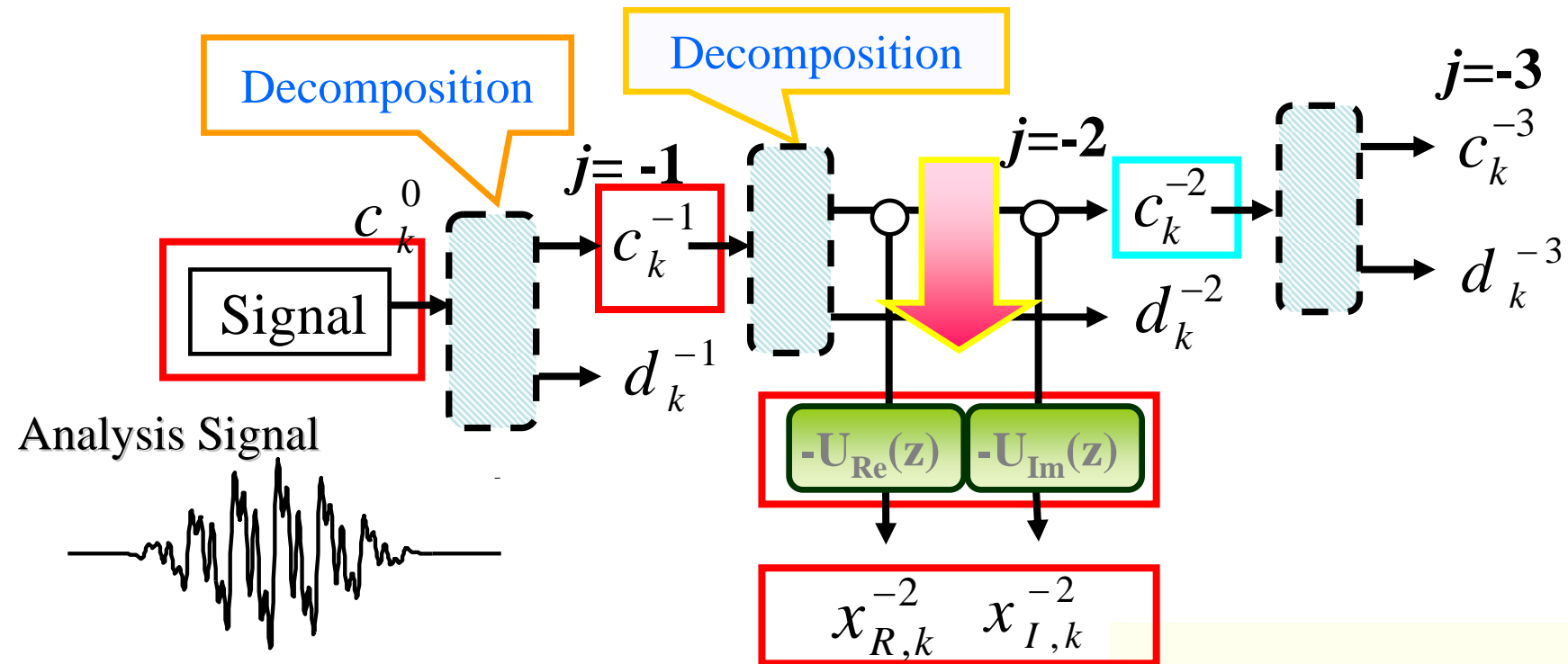
出力





## 6.4 New First WIC by using DWT

### 1) Parasitic-Discrete Wavelet Transform (P-DWT)



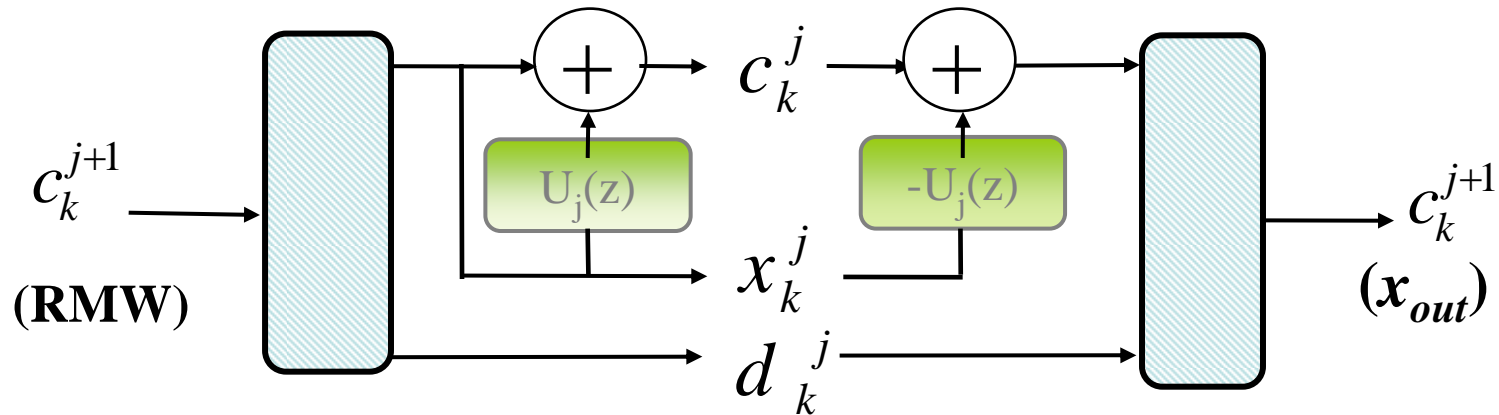
The Fast-WIC (F-WIC)

Detection result

$$R(k) = \sqrt{(x_{R,k}^j)^2 + (x_{I,k}^j)^2}$$



## 2) Design method of the parasitic filter



The Structure for design

1. Use the traditional DWT to decompose the constituted RMW to the parasitic level
2. Assume the coefficients  $\{x_k^j\}$  are the initial parasitic filter sequences  $\{u_k\}$
3. Set  $c_k^j = 0$ ,  $d_k^j = 0$ ,  $x_k^j = \delta$  and calculate by using the inverse transform
4. Optimize  $\{u_k\}$  with the following evaluation function.

$$\arg \min \|x_{out} - RMW\|$$

**In the case of  $U_{Re}$   $U_{Im}$ , they need to design each other**

### 3) Verification experiment

Design of the parasitic filter

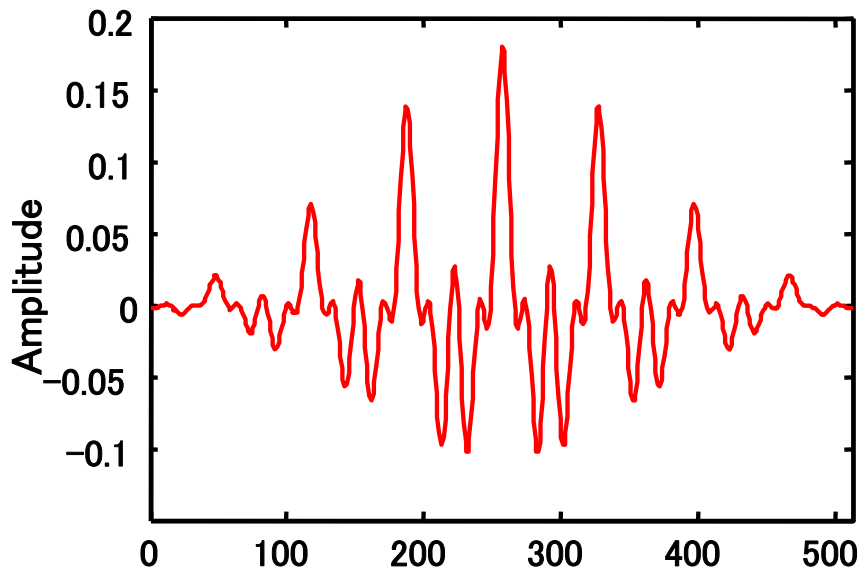
◆ Model signal

$$f(t) = \cos(2\pi 50t) + 0.7 \cos(2\pi 100t) + 0.7 \cos(2\pi 200t)$$

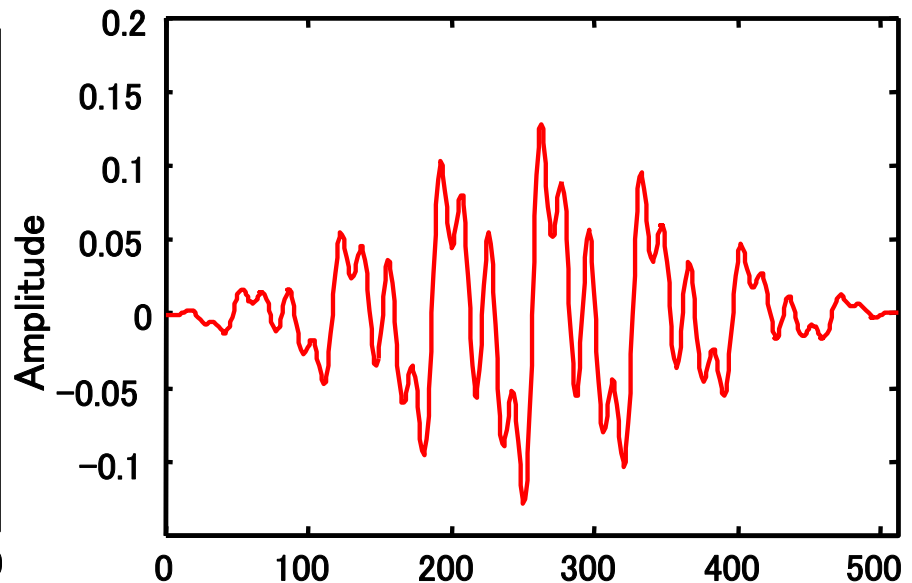
◆ RMW width:512

◆ Sampling frequency :3500Hz

RMW



Real part



Imaginary part

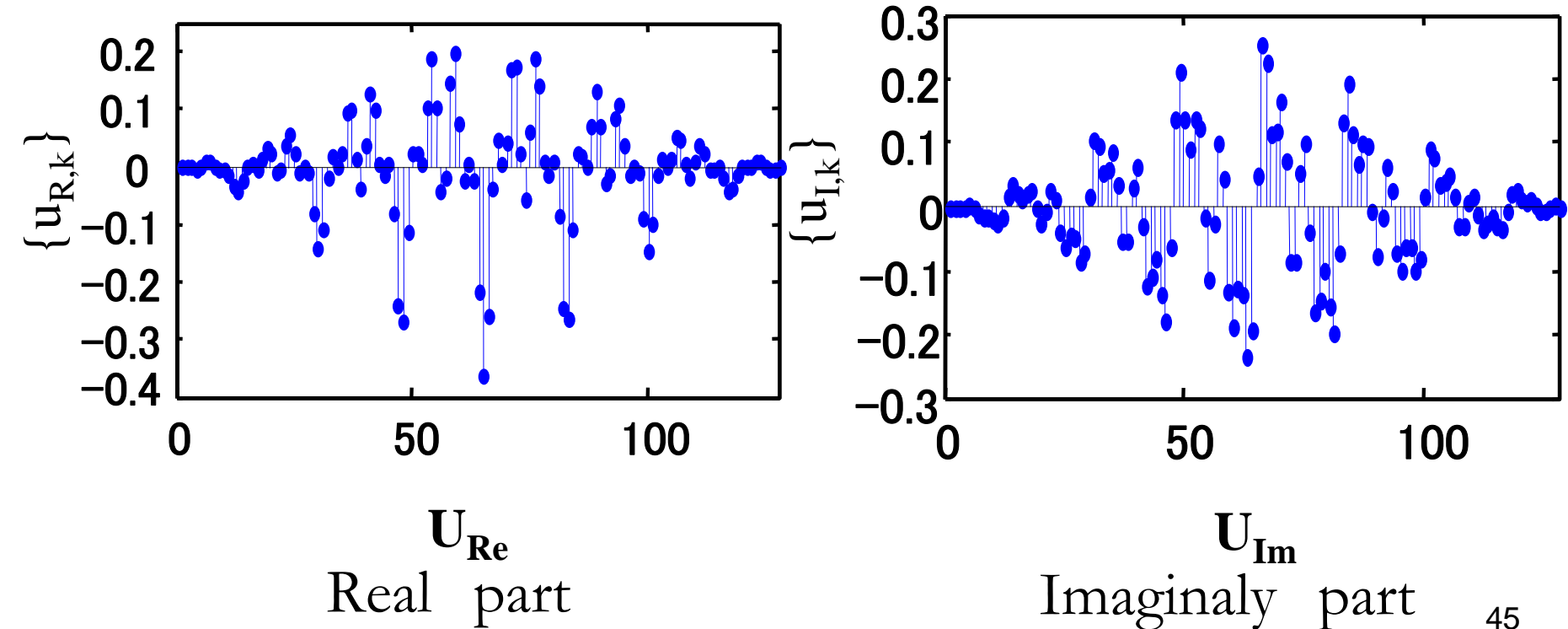


# Verification experiment

Design of the parasitic filter

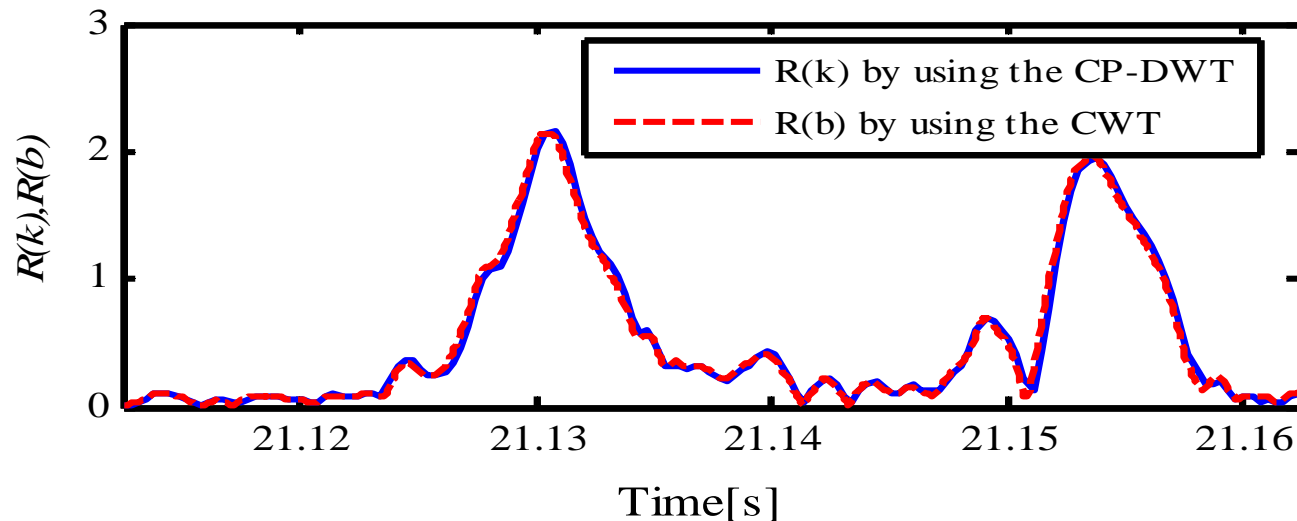
◆ Parasitic level :-2

Parasitic Filter



#### 4) Example of Detection result in the MGR ( z direction)

- The F-WIC  $R(k)$  by using *the* P-DWT of the vibration signal in the  $z$  direction at the positions of the MGR.
- The WIC  $R(b)$  calculated by using the CWT also is shown in this figure
- we also define the mean square error (MSE) in the case of the MGR. MGR is -37.0 [dB].



# 6. Real Signal Wavelet Transform

## 6.1 Construction of Real-Signal MW

- 1) Selection of window function
- 3) Construction of a complex RMW

## 6.2 Detection of abnormal signal

- 1) Definition of Wavelet Instantaneous Correlation
- 2) Knocking extraction from block vibration

## 6.3 Construction of RMW using more than two signal

- 1) Flow chart of SCRMW construction
- 2) Construction Method of A-RMW
- 3) Rattle Noise Source Detection

## 6.4 New First WIC by using DWT

- 1) Parasitic-Discrete Wavelet Transform (P-DWT)
- 2) Design method of the parasitic filter
- 4) Example of Detection result in the MGR ( z direction)

**Report title:**

**Wavelet transform from my viewpoint**

Deadline: February 28, PM5:00, Office