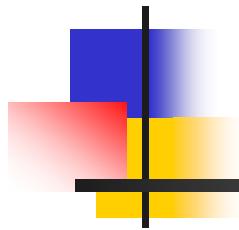


# Νέες Τεχνολογίες στην Ανάλυση της Κινησης



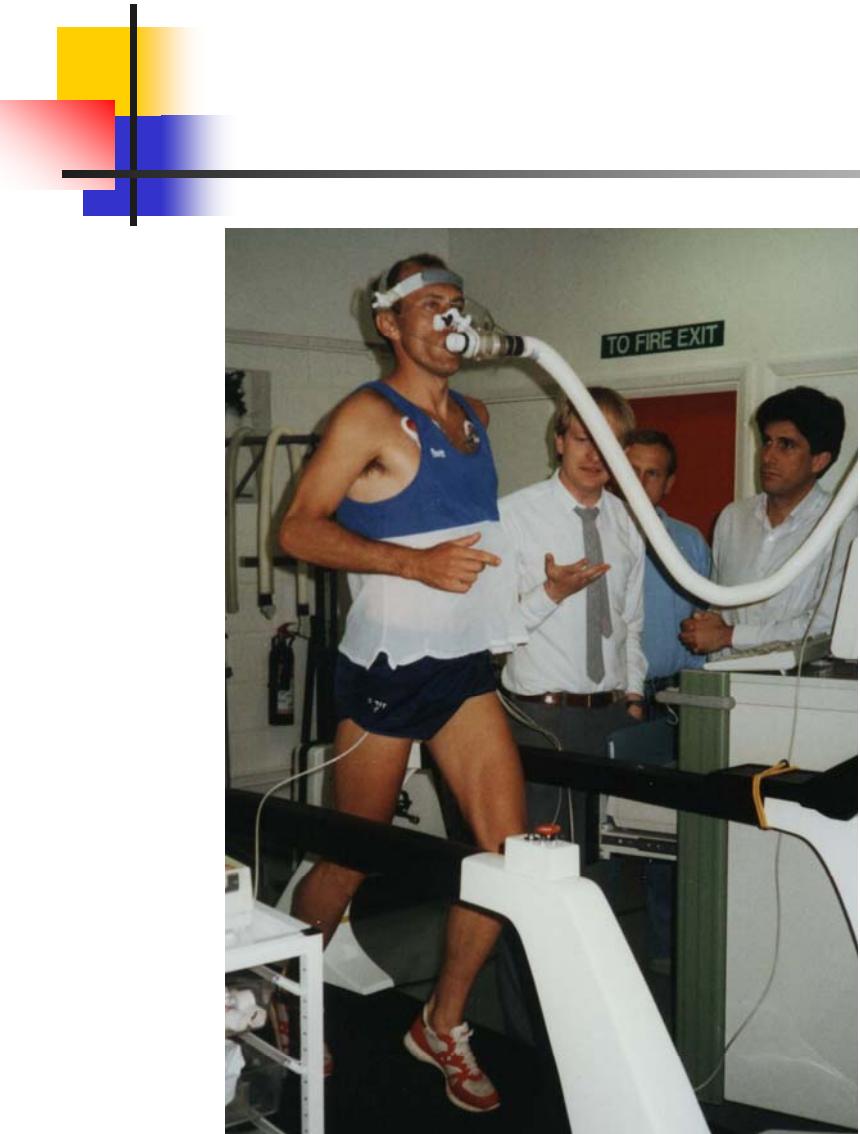
Διάλεξη 1  
Σφάλμα – Ανάλυση χρόνου και συχνοτήτων –  
Εξομάλυνση δεδομένων

Γιάννης Γιάκας PhD  
[ggiakas@pe.uth.gr](mailto:ggiakas@pe.uth.gr)

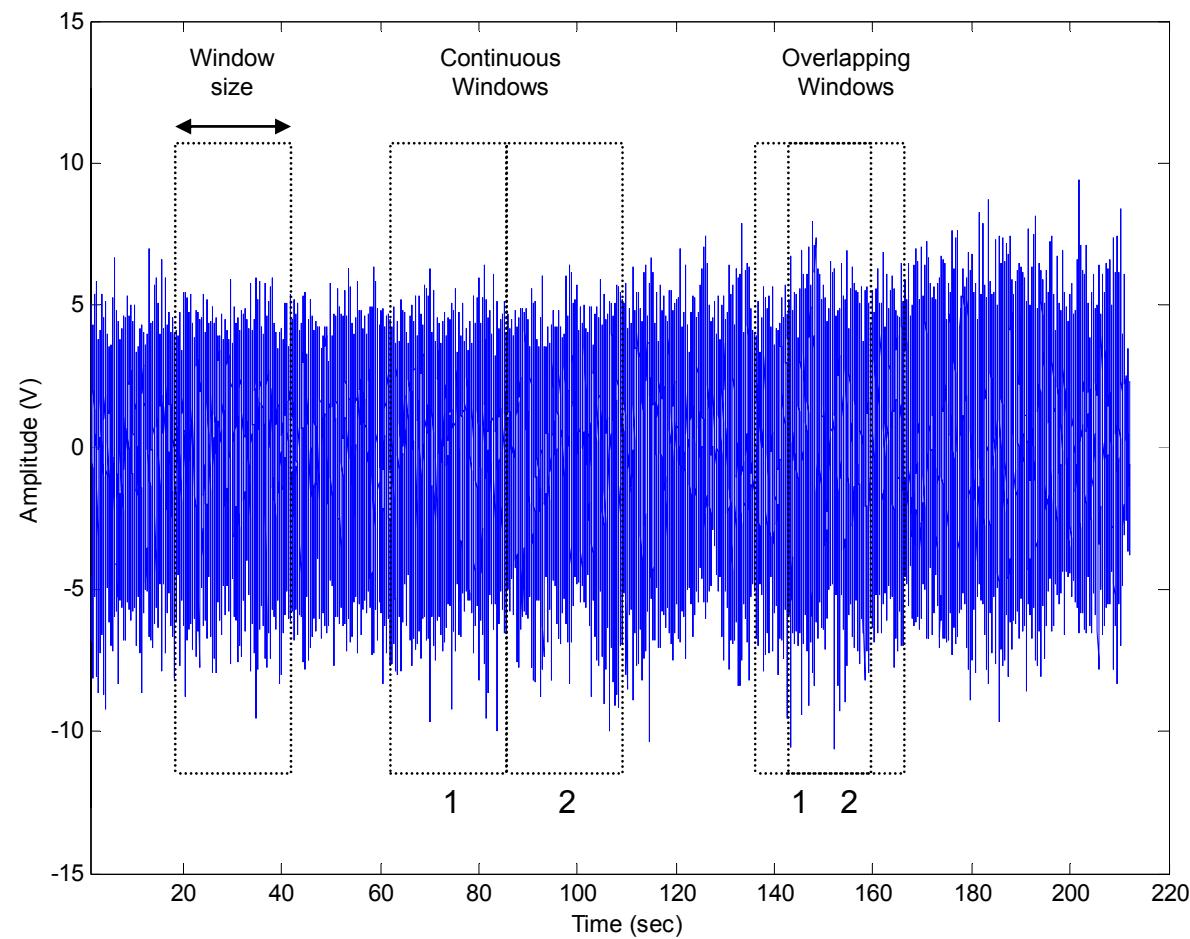


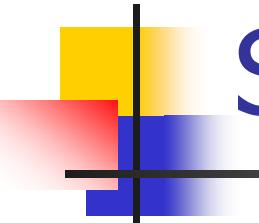
# Presentation Outline

- Background – Problems
- Solutions
- Current / future research

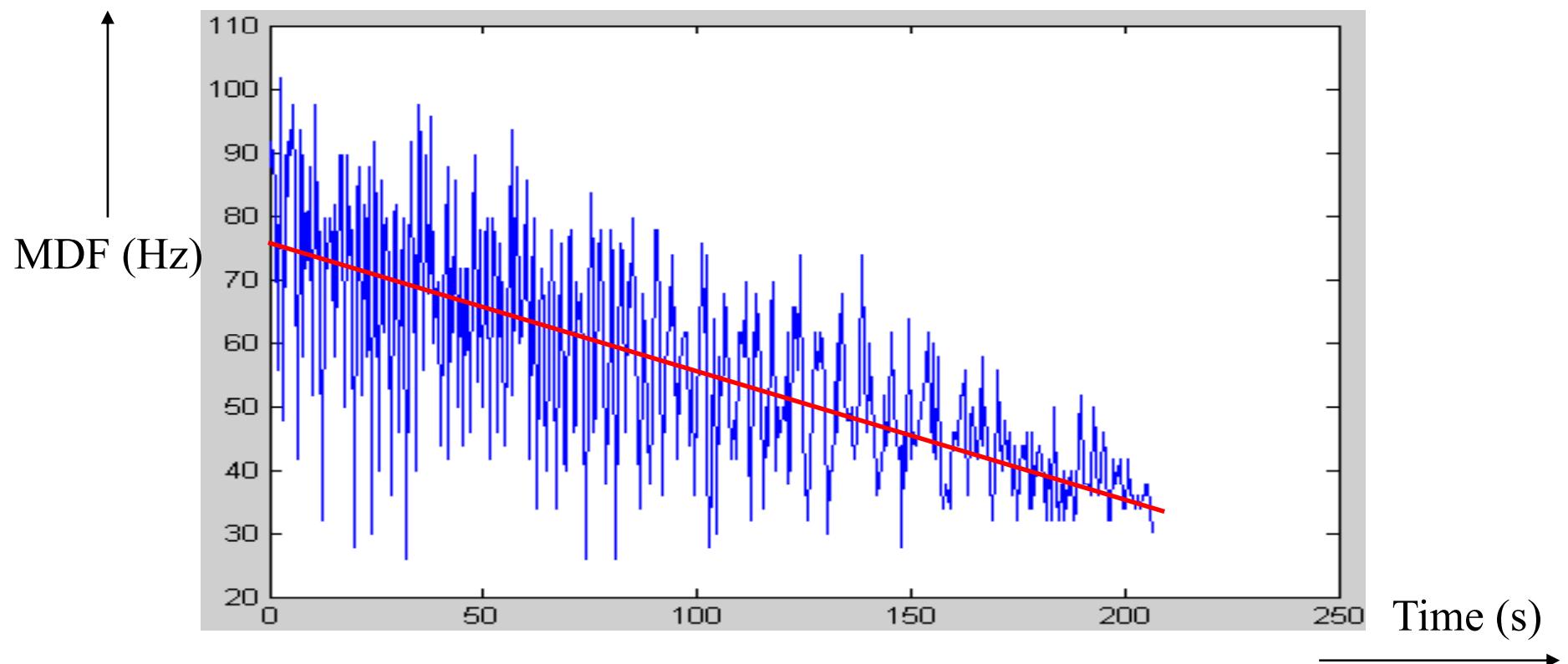


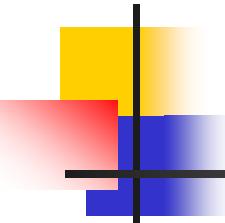
# Signal analysis



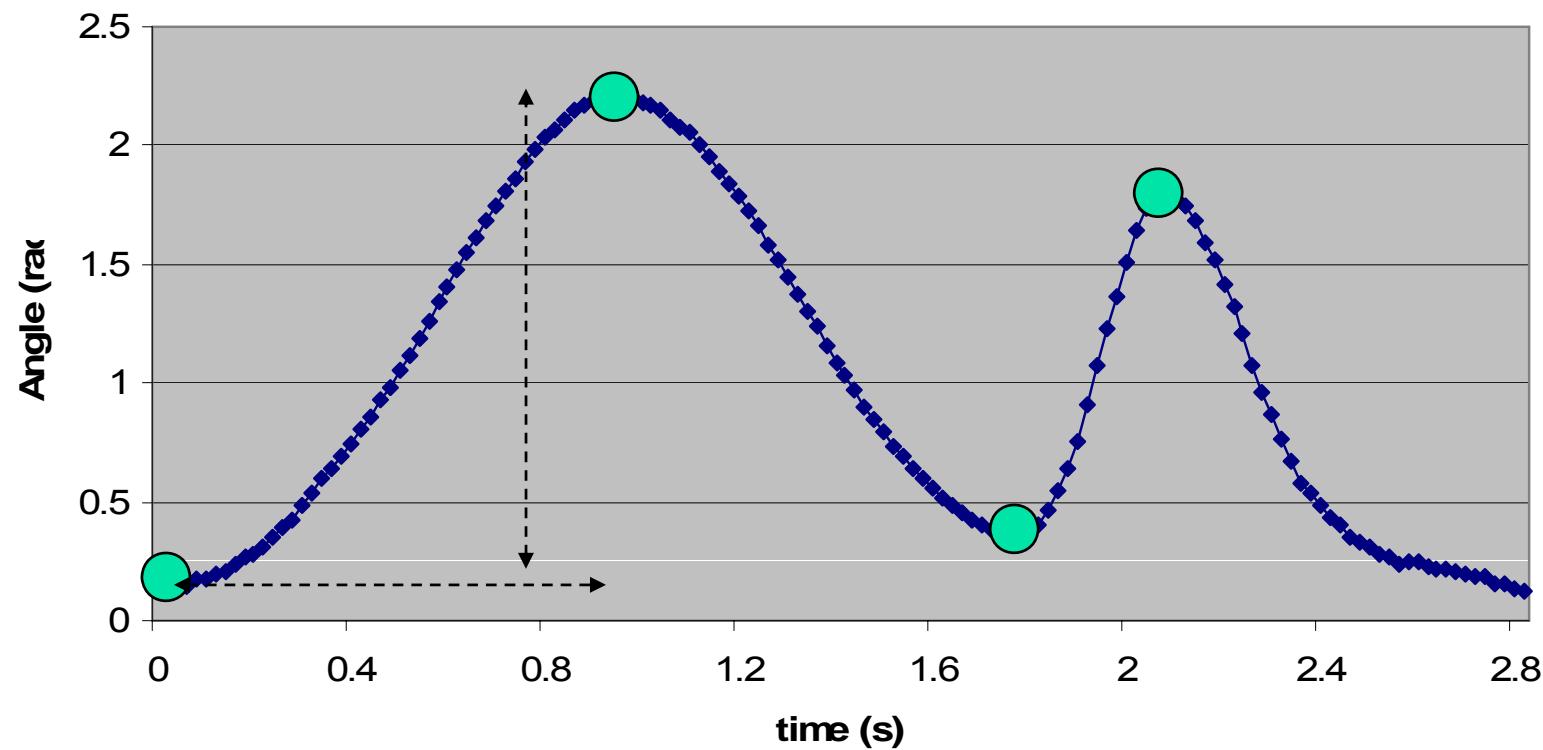


# Signal analysis

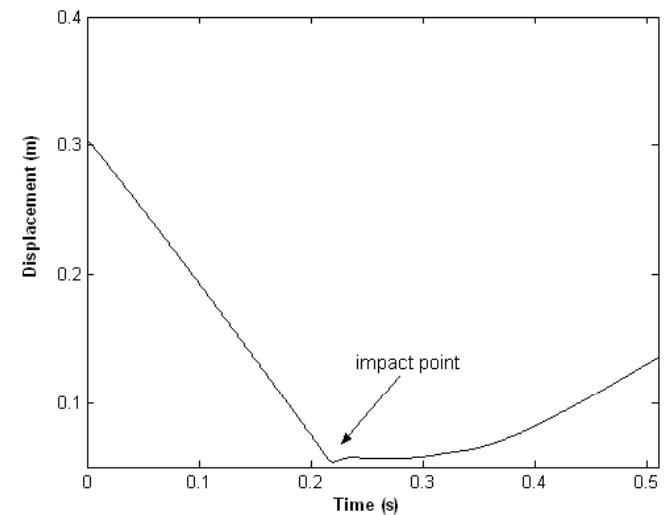
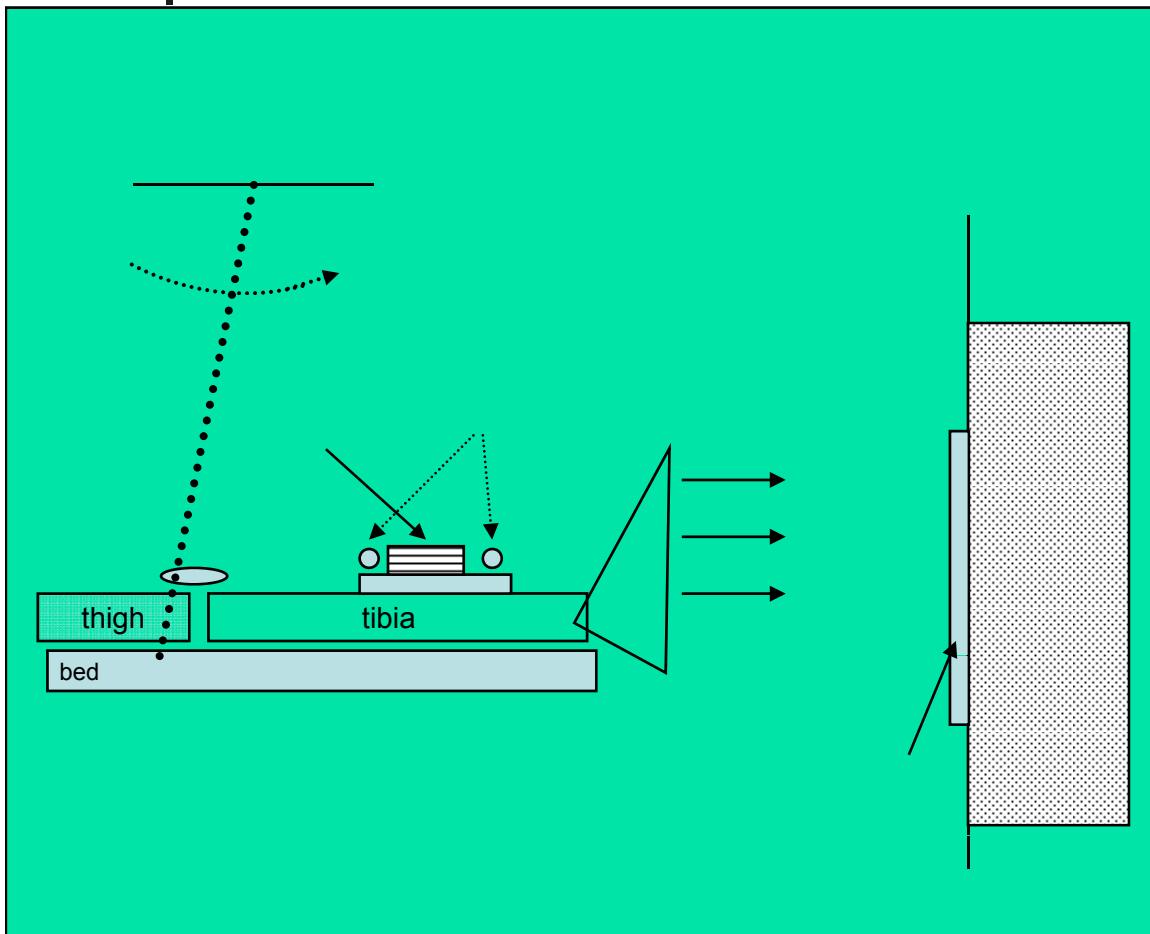


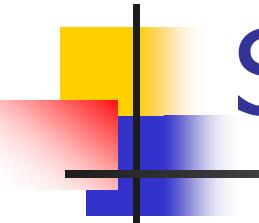


# Signal analysis

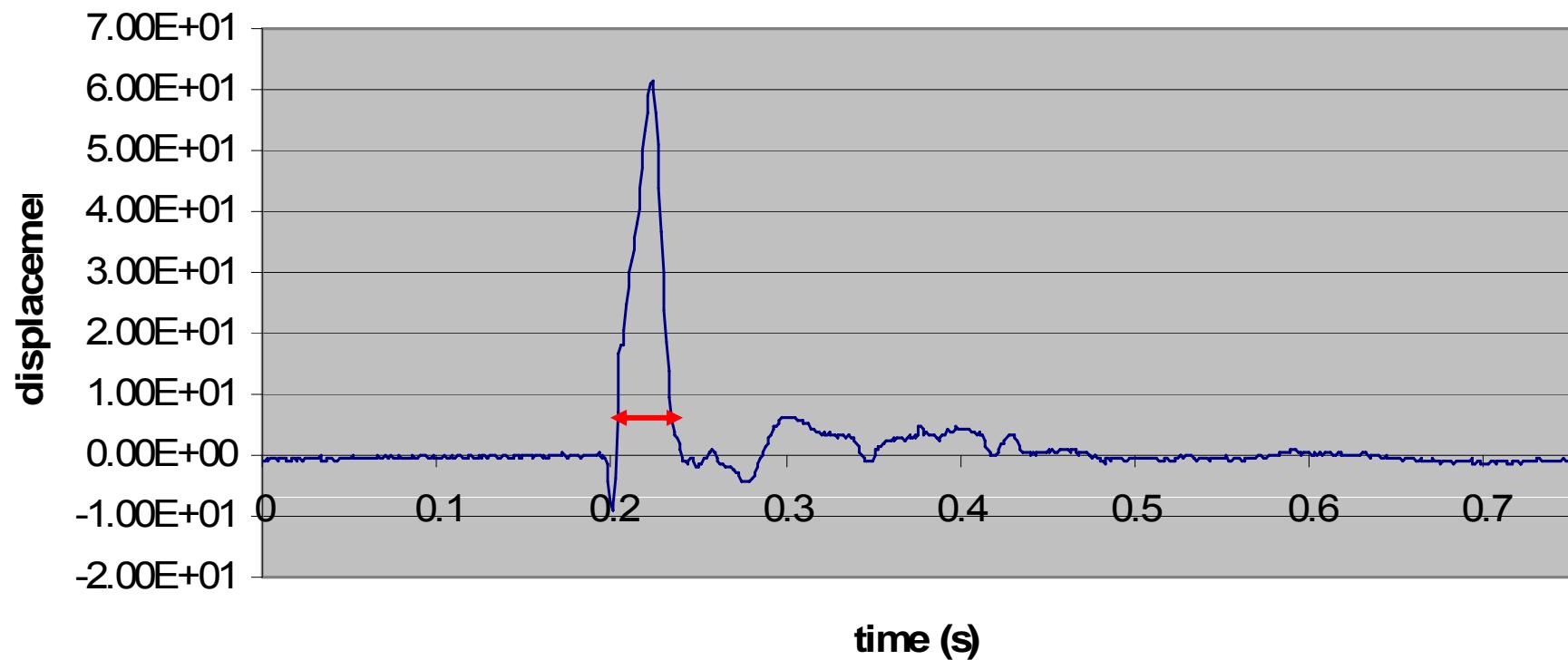


# Signal analysis

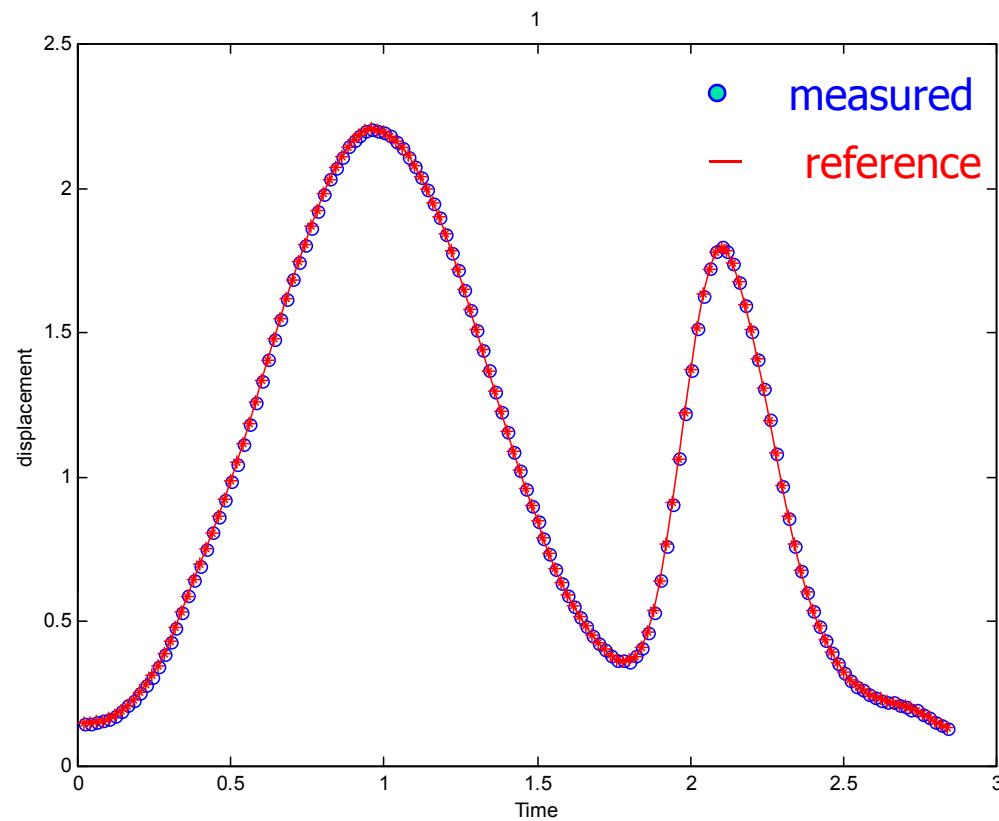




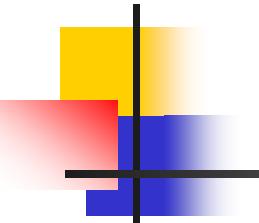
# Signal analysis



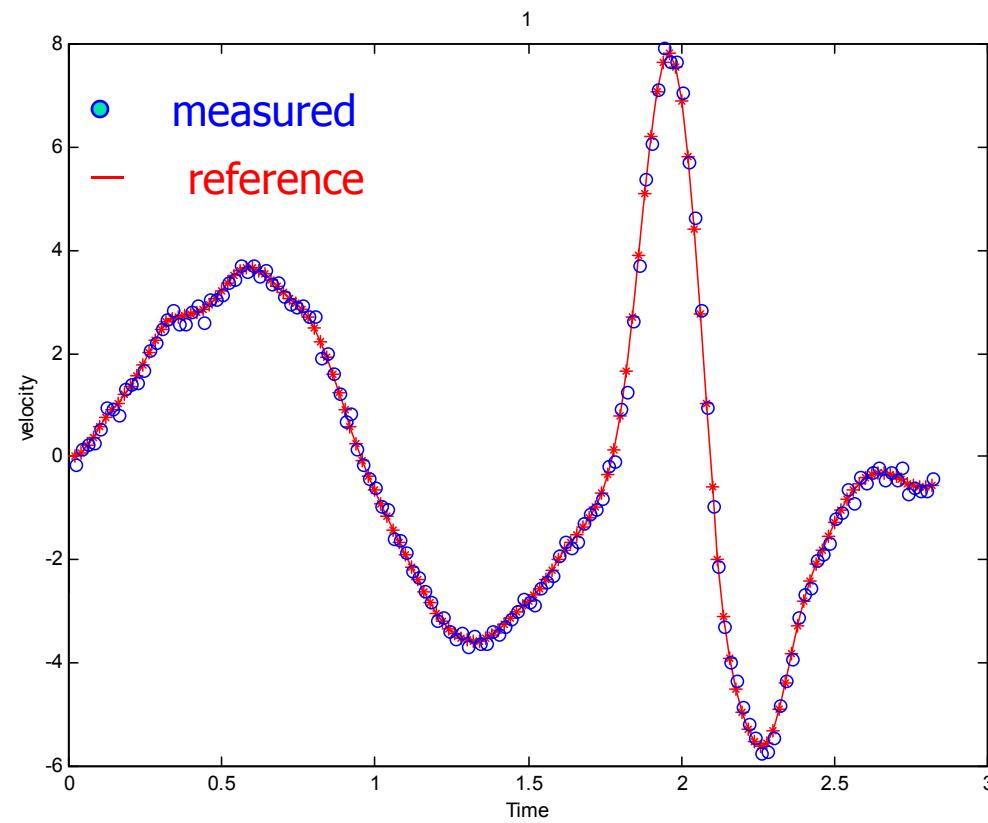
# The effect of error : displacement



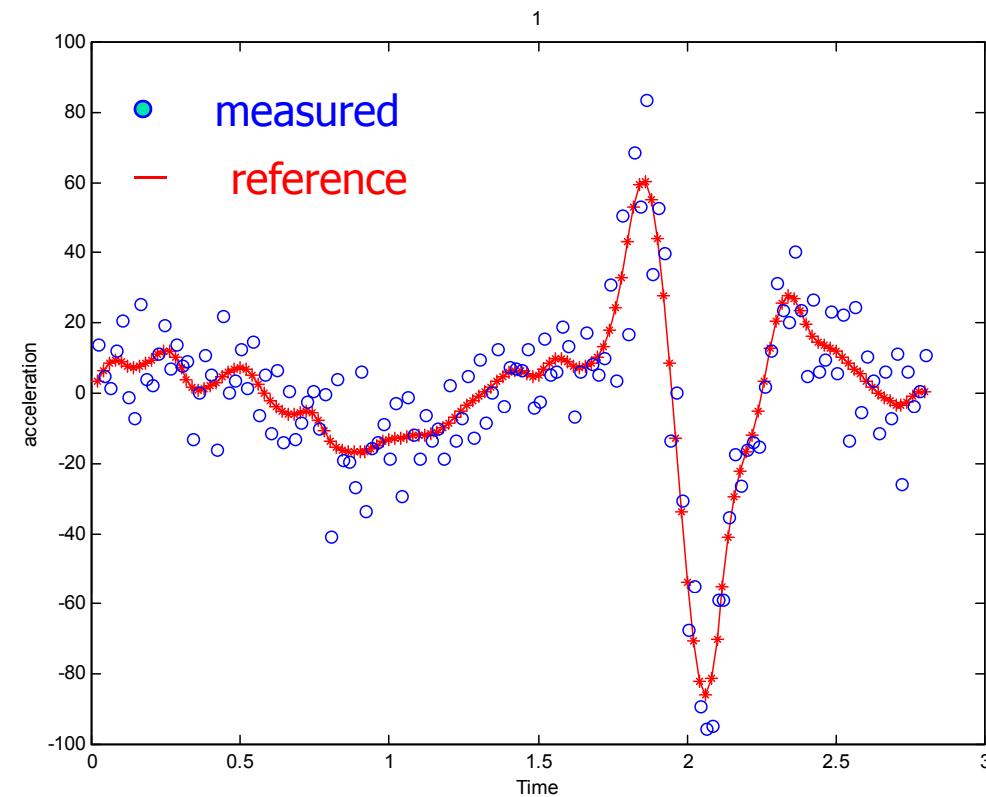
Pezzack, 1977; Lanshammar, 1982

- 
- Velocity = displacement / time
    - Velocity = DER(Displacement)
  - Acceleration = velocity / time
    - Acceleration = DER (Velocity) = DER\_DER(Displacement)

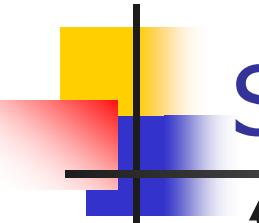
# The effect of error : velocity



# The effect of error : acceleration



Reference acceleration provided by Graeme Wood, 1997



## Sources of error

Error

Measurement  
device

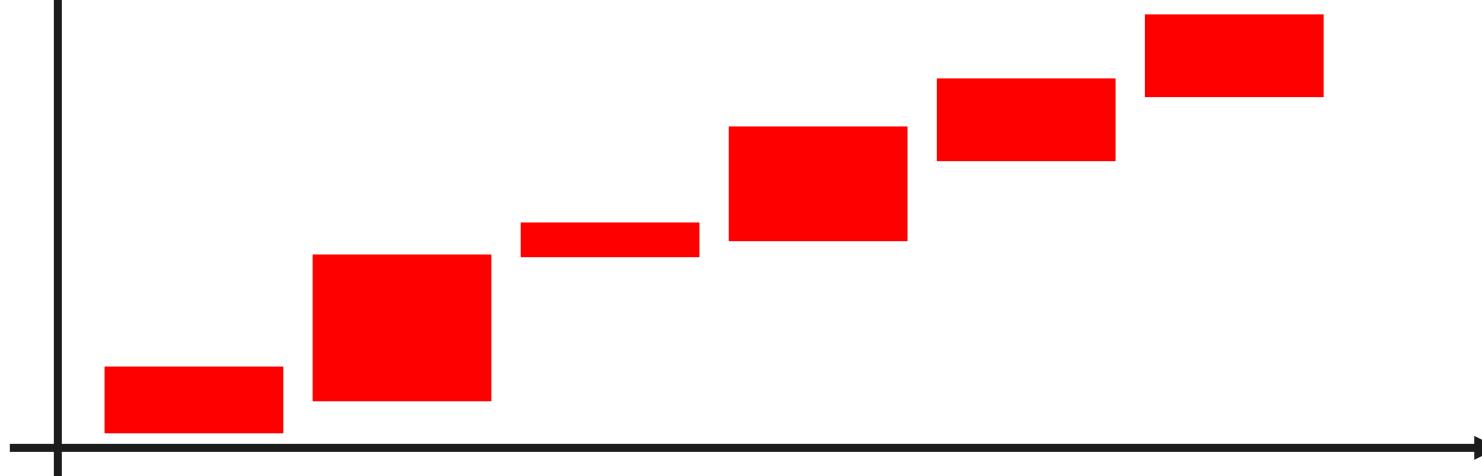
Differentiation

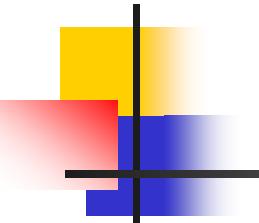
Camera  
Calibration

Marker  
identification

....

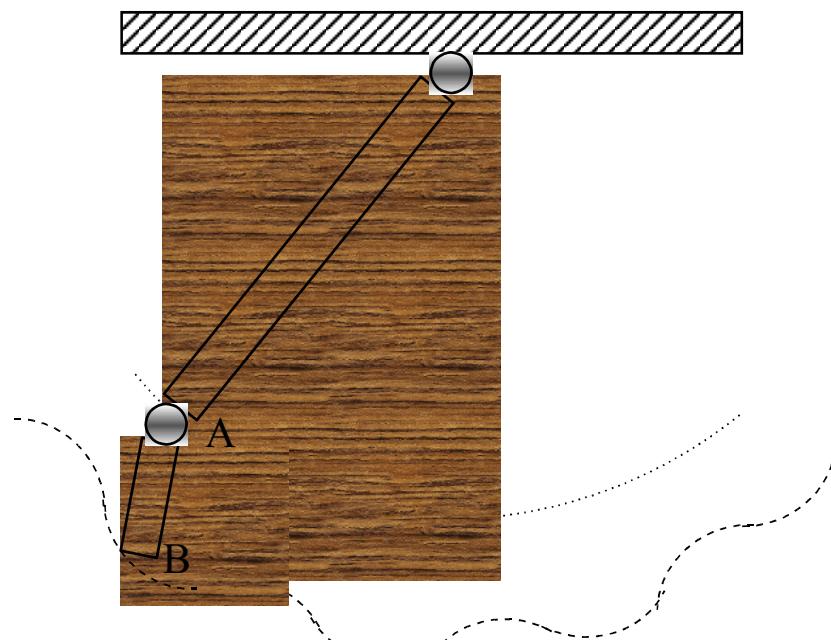
3-D

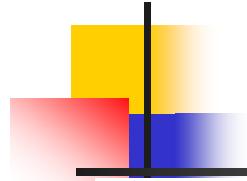




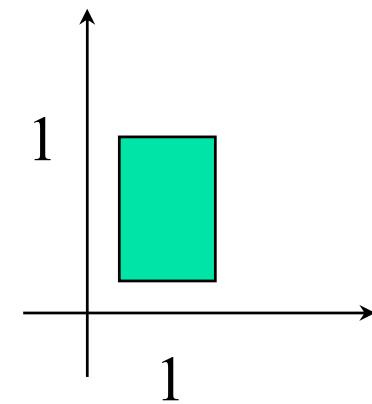
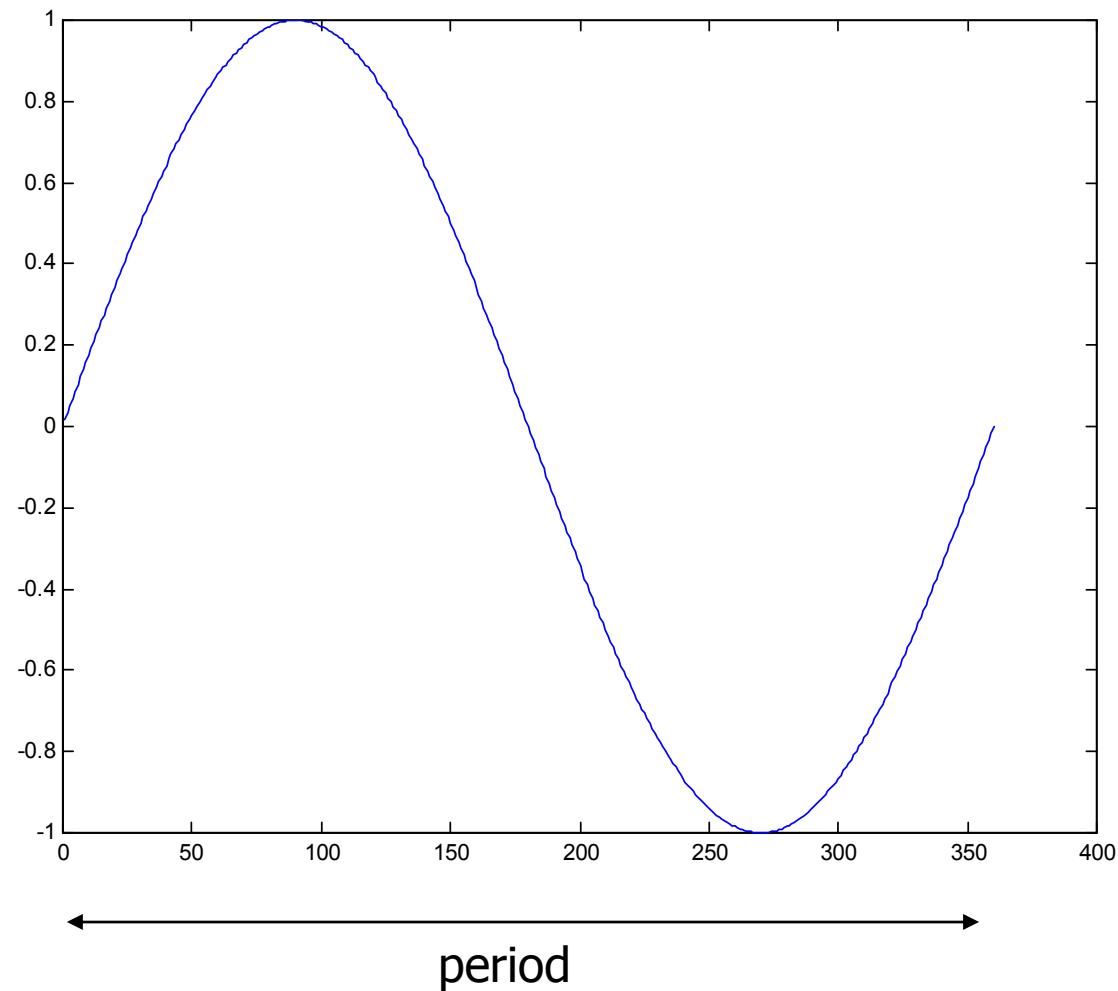
# Why is this happening ?

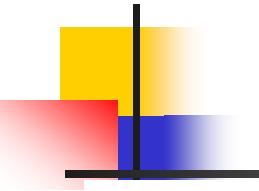
- Frequency domain analysis



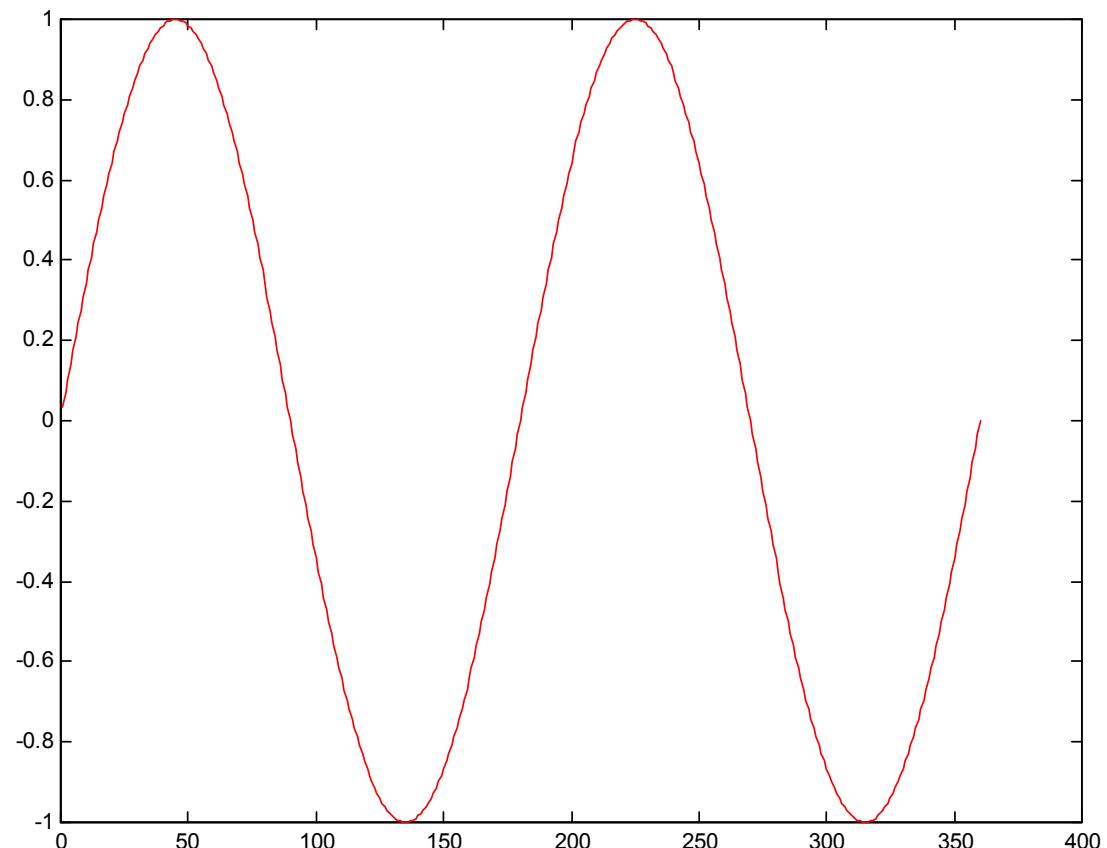


# 1\*Sin(1x)

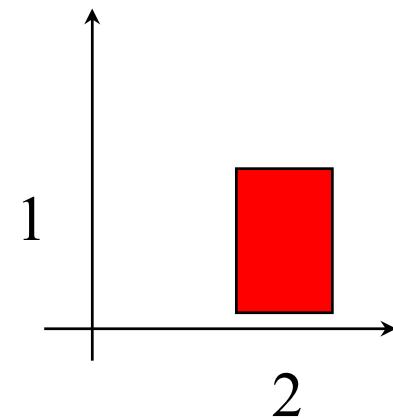


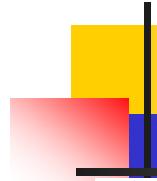


# $1 * \text{Sin}(2x)$

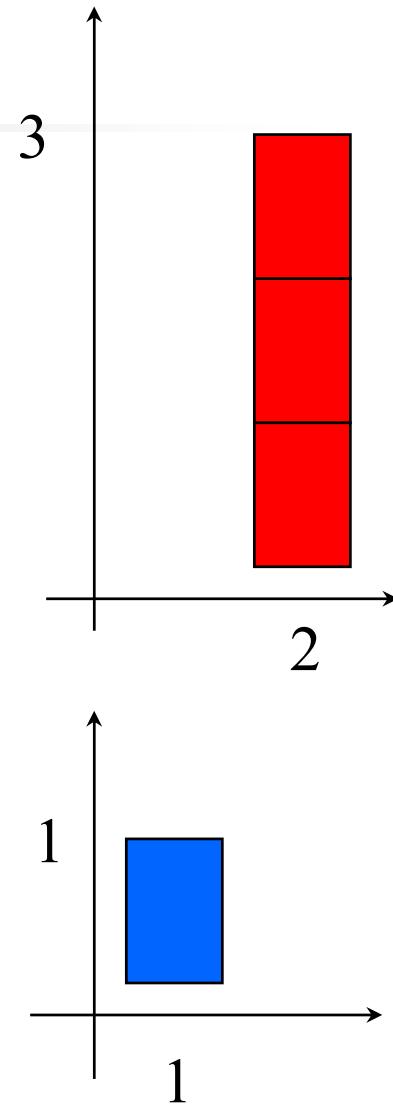
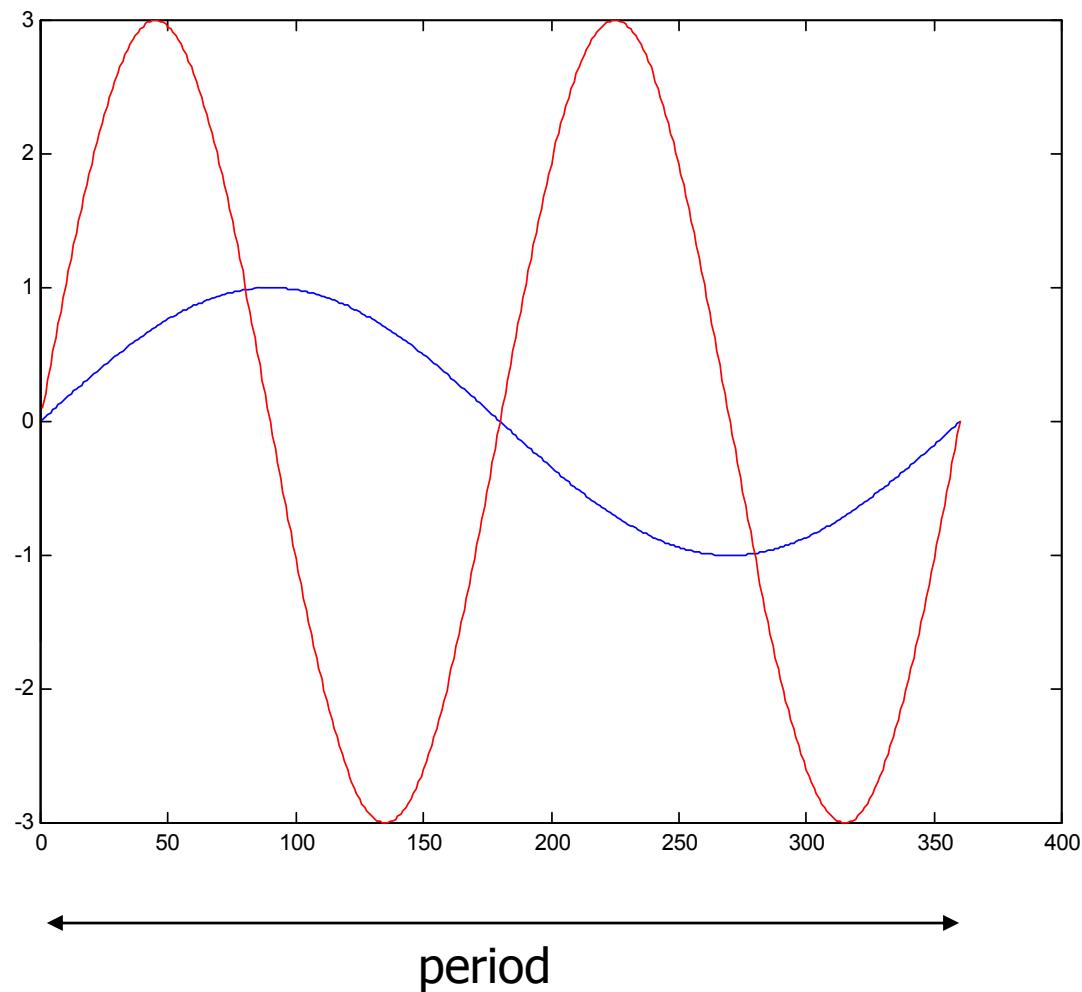


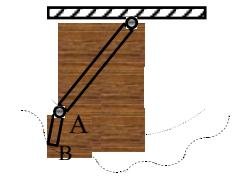
← →  
period



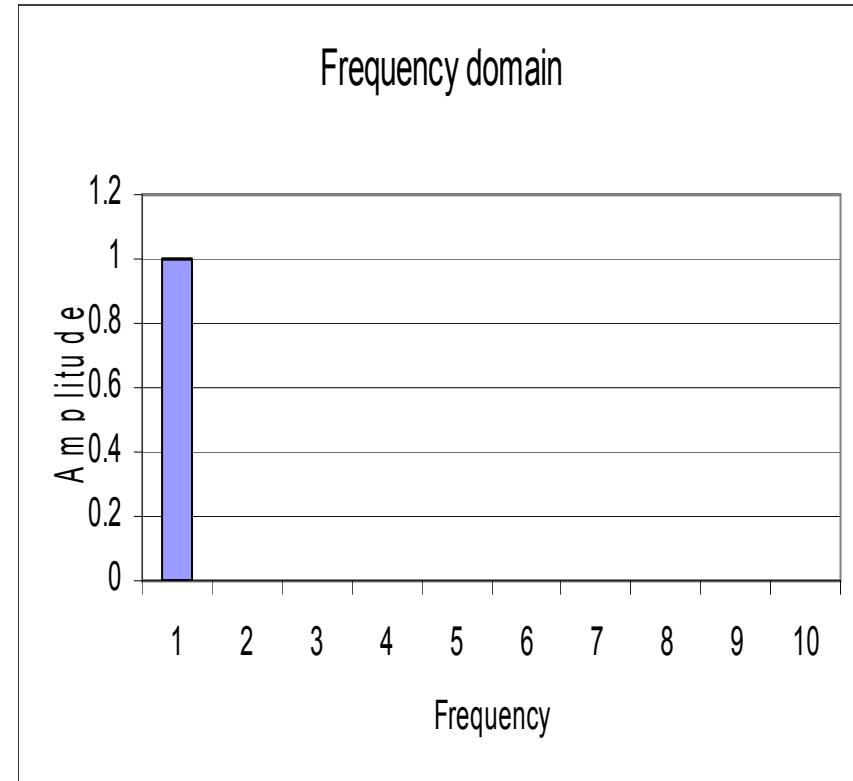
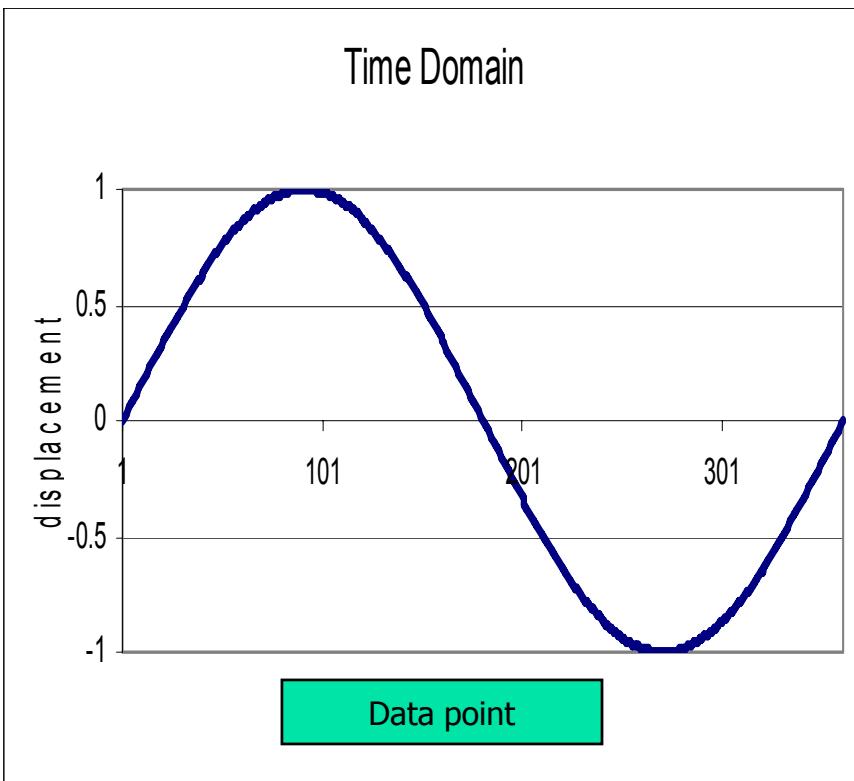


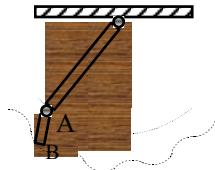
$\text{Sin}(x)$  -----  $3*\text{Sin}(2x)$



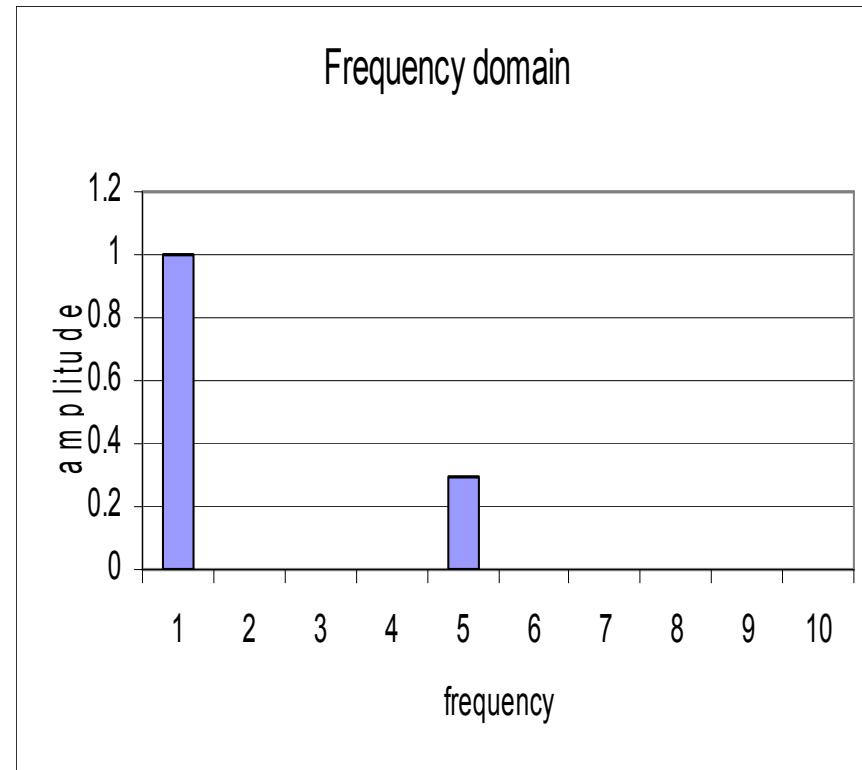
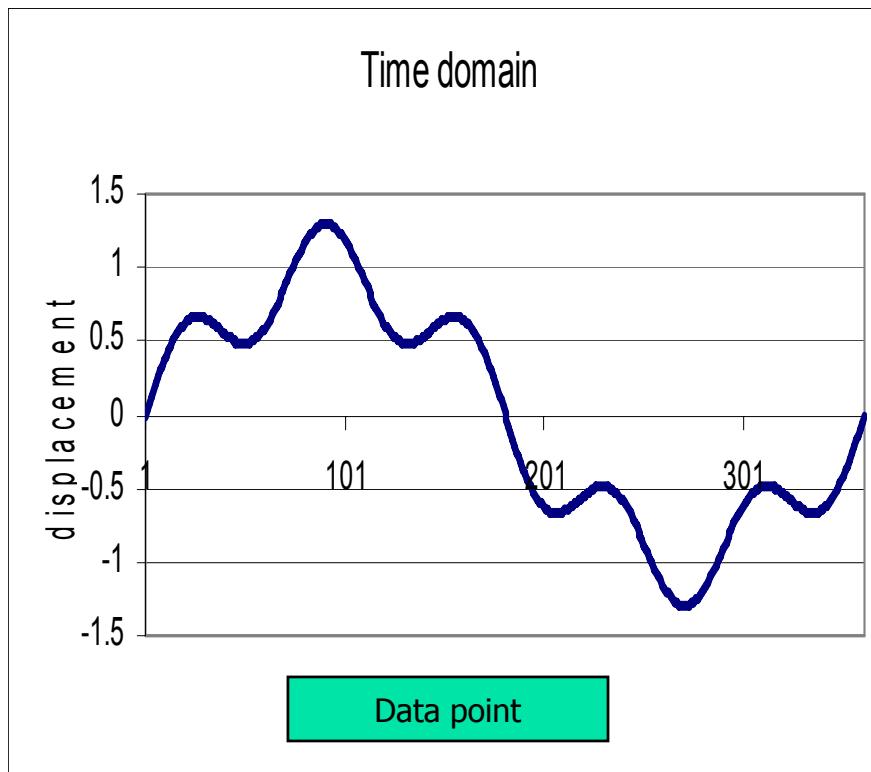


# Time domain - Frequency domain



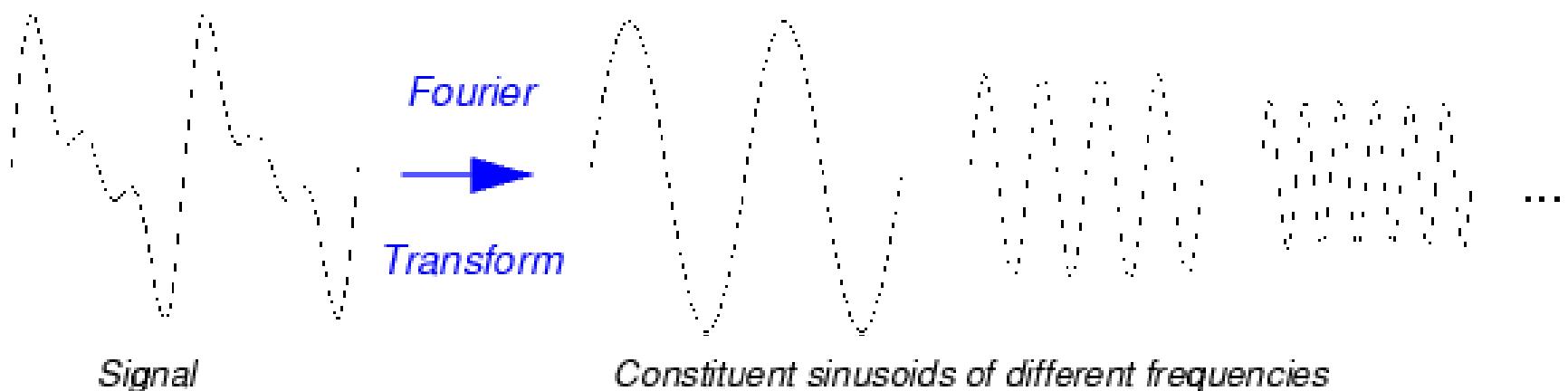


# Time domain - Frequency domain

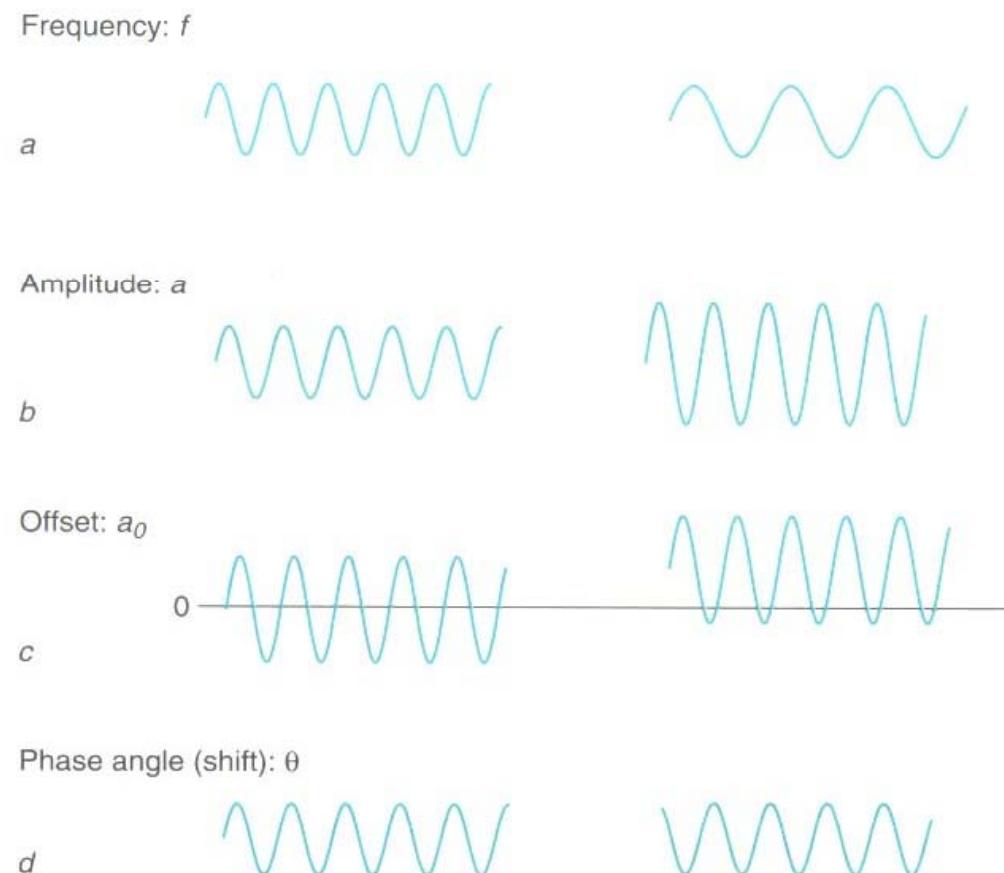


# Time domain - frequency domain (Fourier Transform)

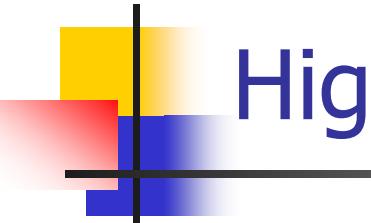
$$\text{Signal} = \sum [a \sin x + b \cos x] + c$$



# Four essential components of time-varying signal



• **Figure 11.2** The four essential components of a time-varying signal.



## Higher derivatives

- Velocity and acceleration
- Any error included in the displacement data will significantly be amplified via the differentiation process (ill posed problem)

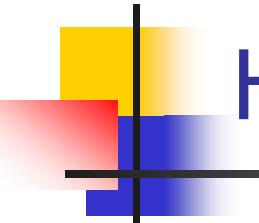

$$\text{Signal} = \sum [a \sin x + b \cos x] + c$$

$$\text{DER}(\sin a^*x) = a^* \cos a^*x$$

$$\text{DER}(\cos a^*x) = -a^* \sin a^*x$$

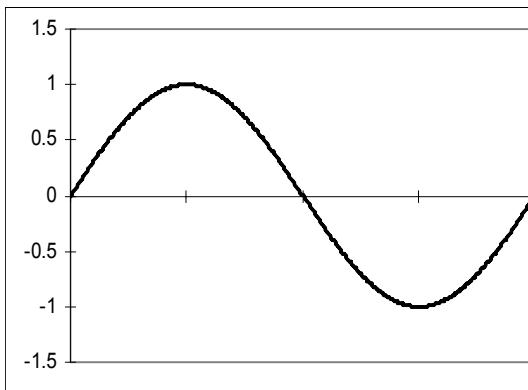
e.g.

$$\text{DER}(0.1 \cdot \sin(30^*x)) = 0.1 \cdot 30 \cdot \sin(30^*x)$$

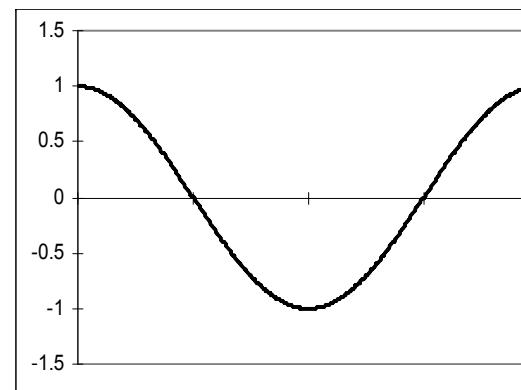


# Higher derivatives

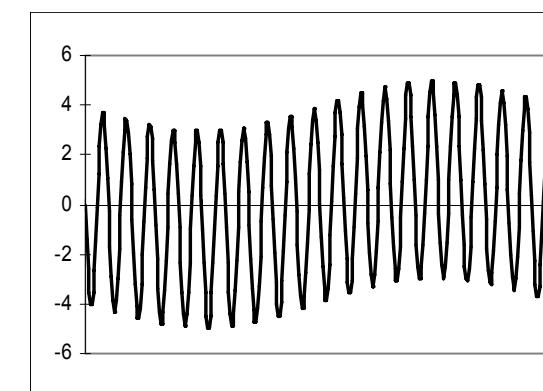
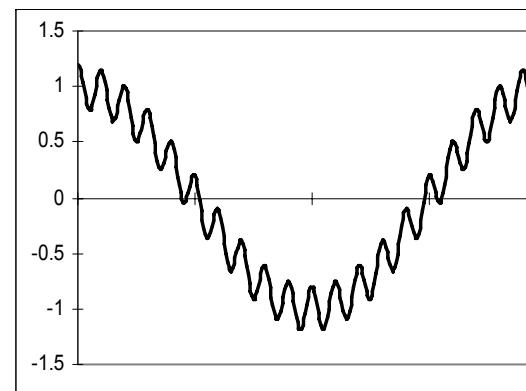
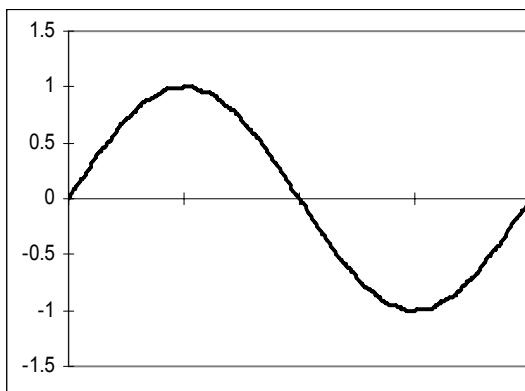
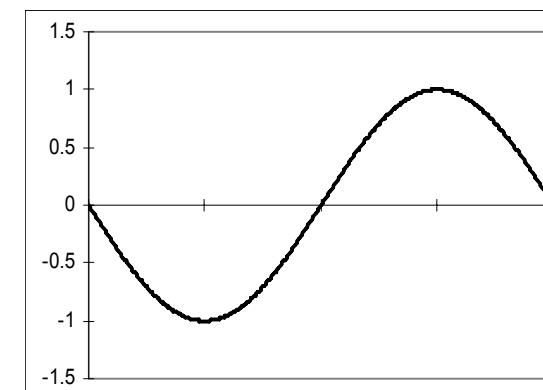
Displacement



Velocity

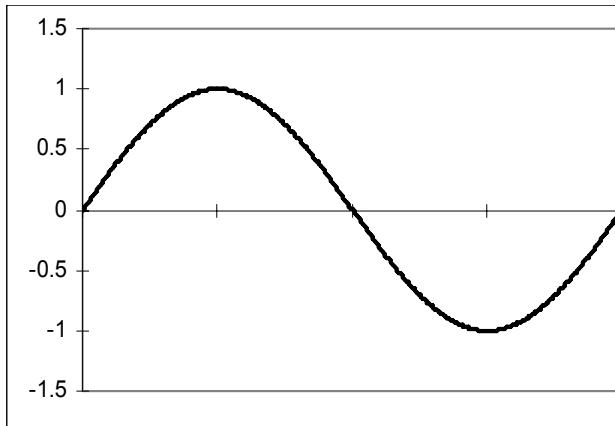


Acceleration

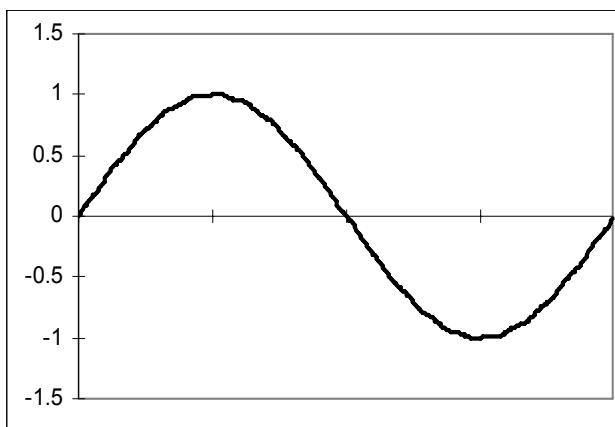
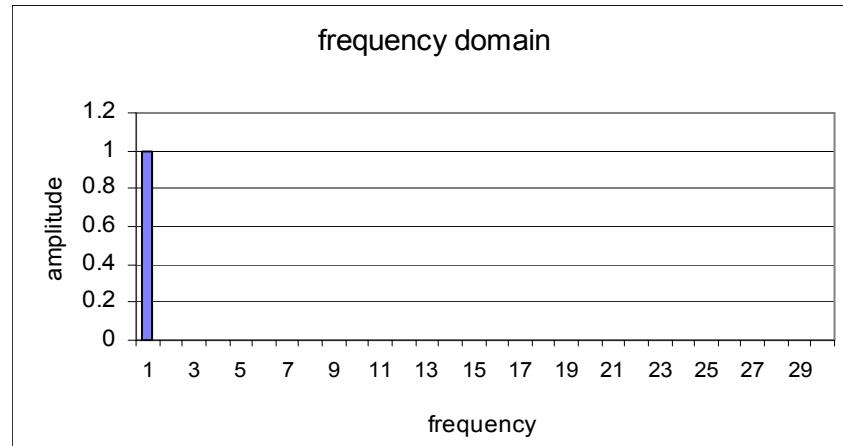


# Displacement

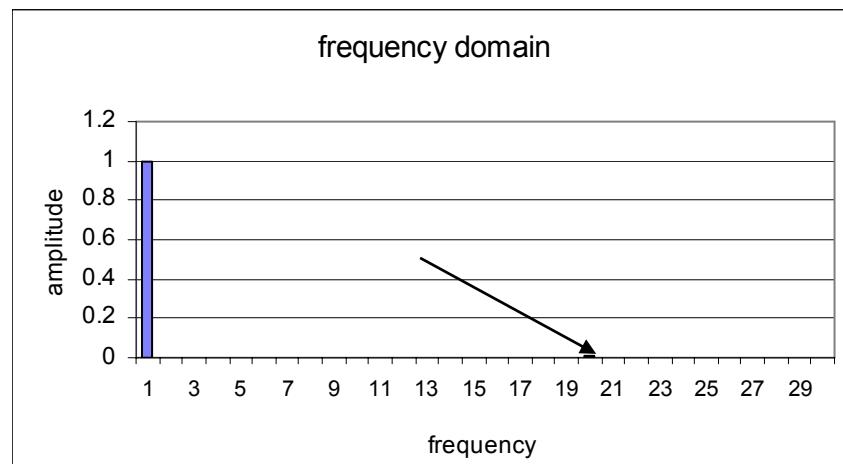
Clean signal



frequency domain



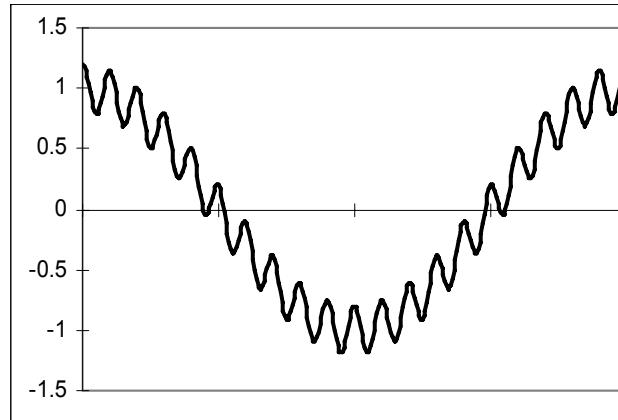
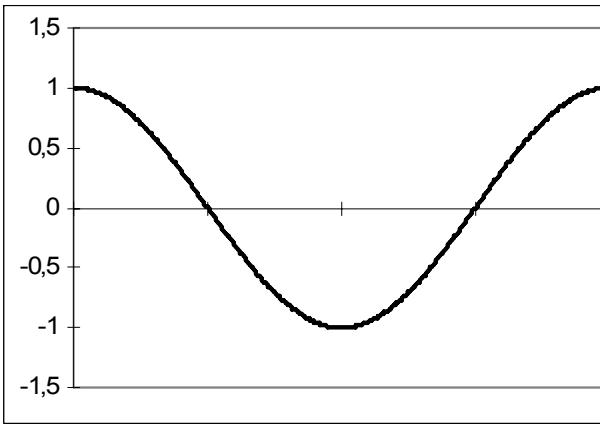
Noisy signal



Data reproduced by Hatze (1990)

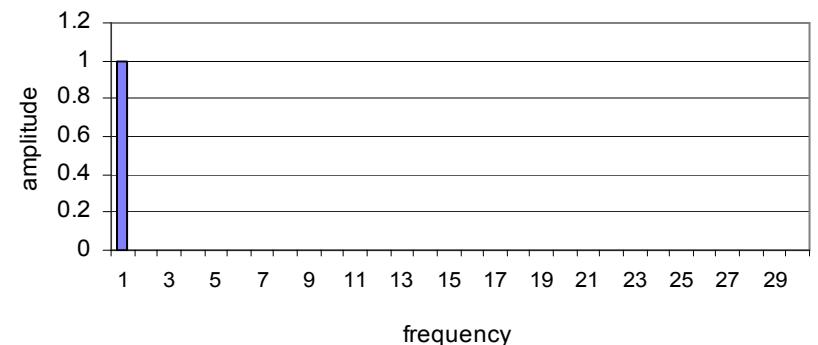
# Velocity

Clean signal

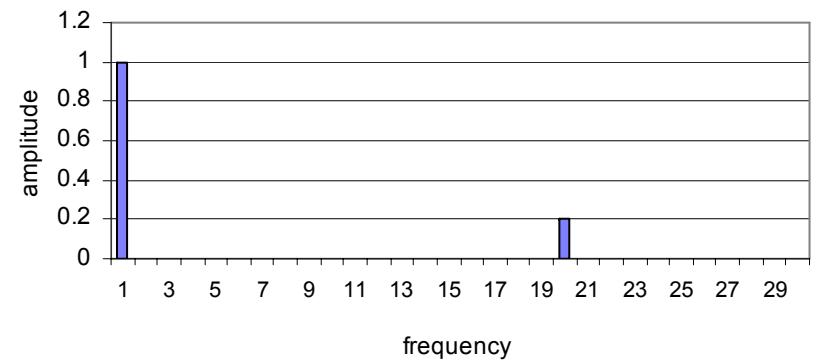


Noisy signal

frequency domain



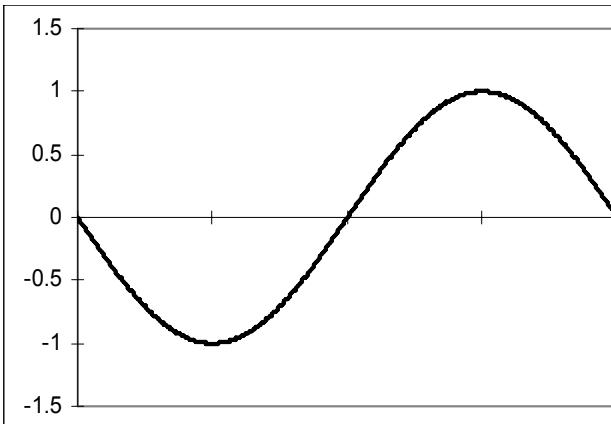
frequency domain



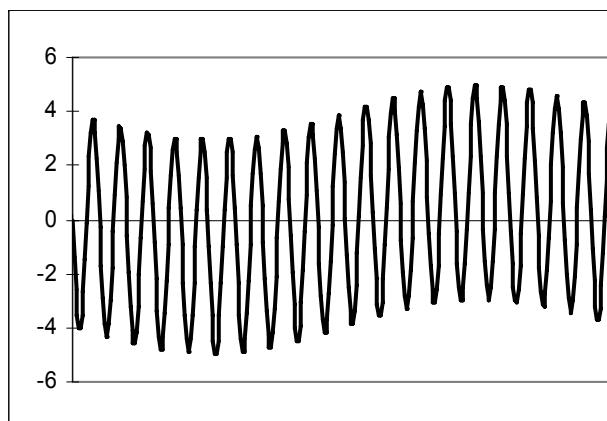
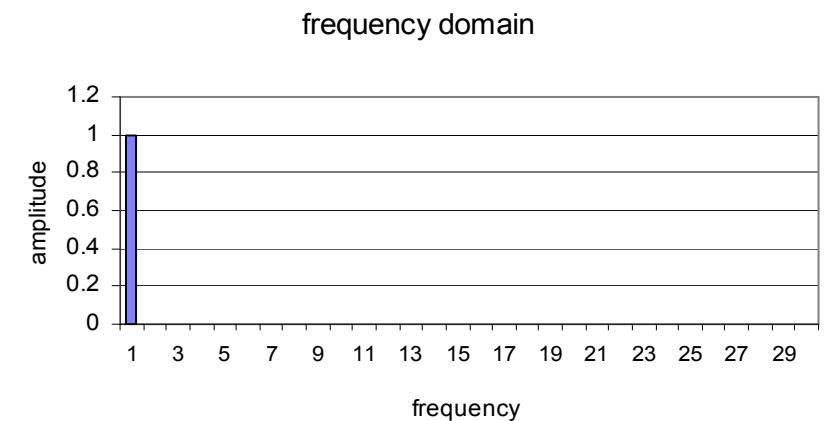
Data reproduced by Hatze (1990)

# Acceleration

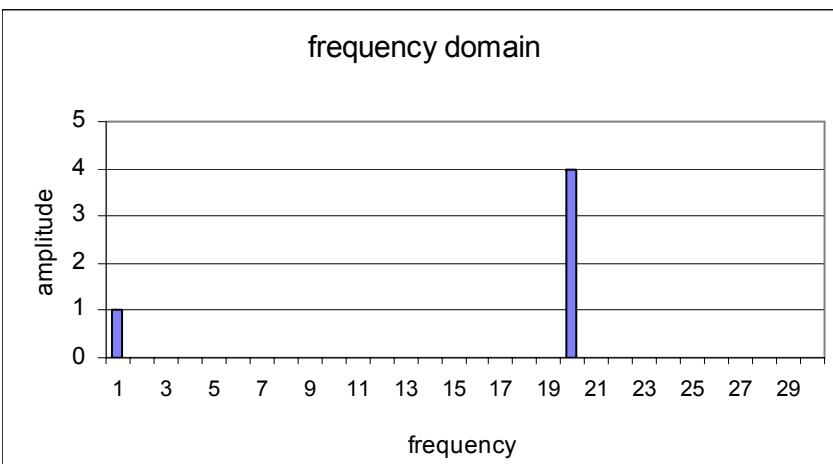
Clean signal



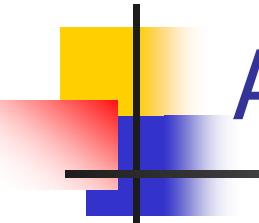
frequency domain



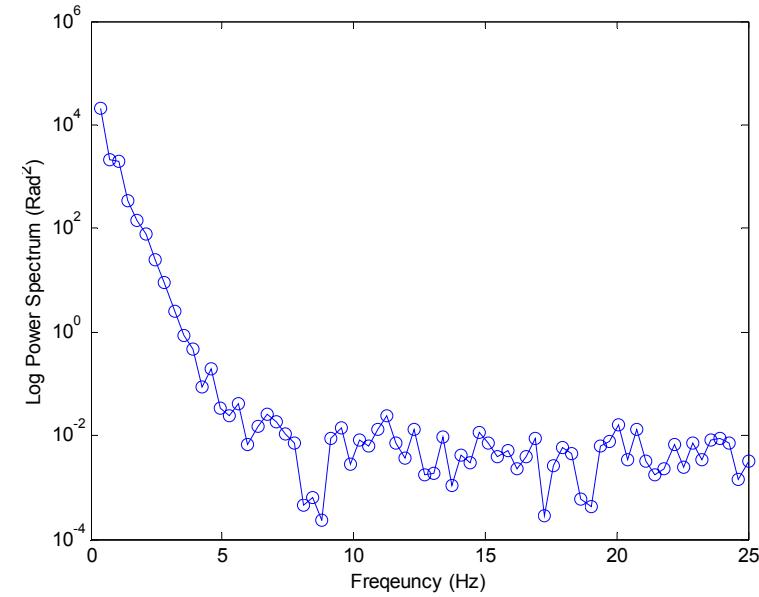
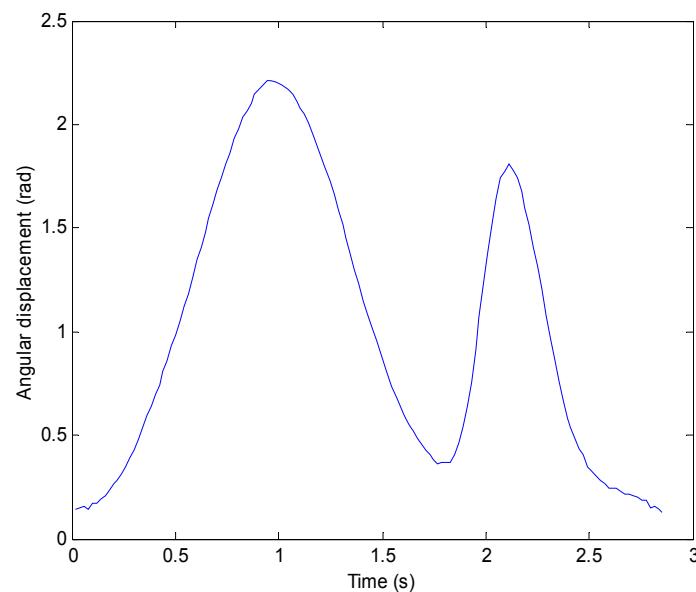
frequency domain



Data reproduced by Hatze (1990)

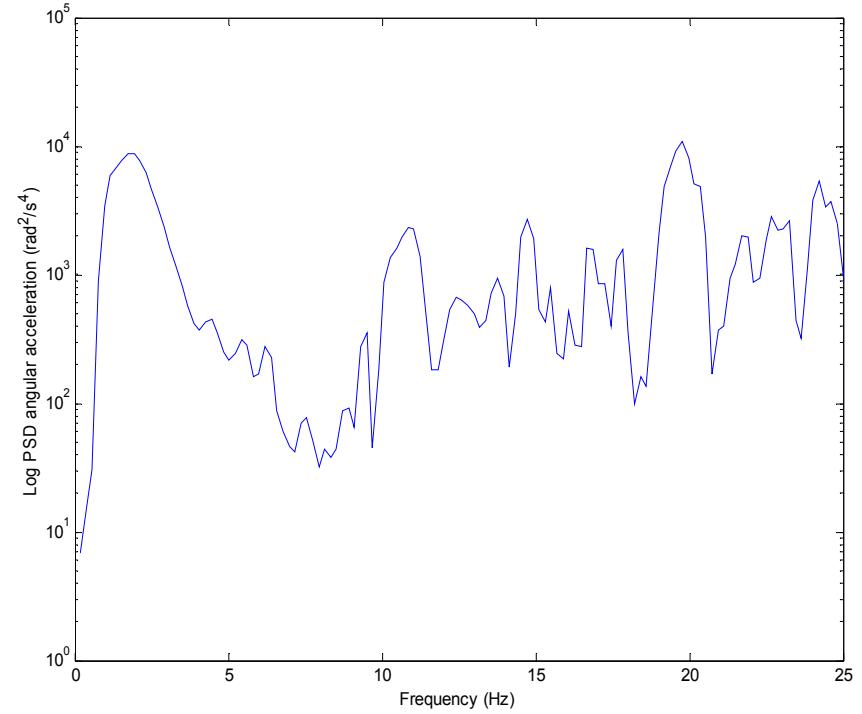
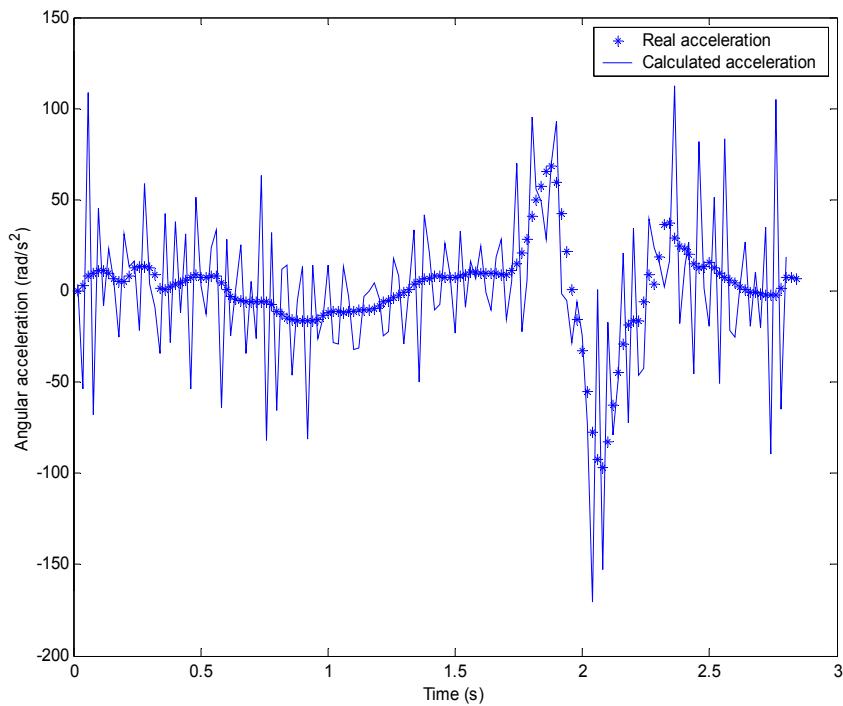


# Angular displacement of the elbow

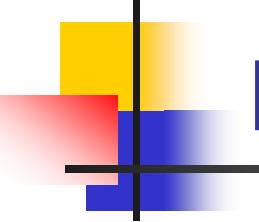




# Angular acceleration of the elbow



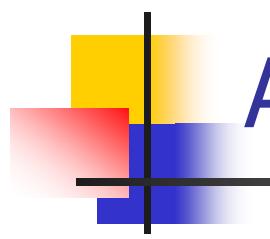
Giakas, Stergioulas and Vourdas, 2000



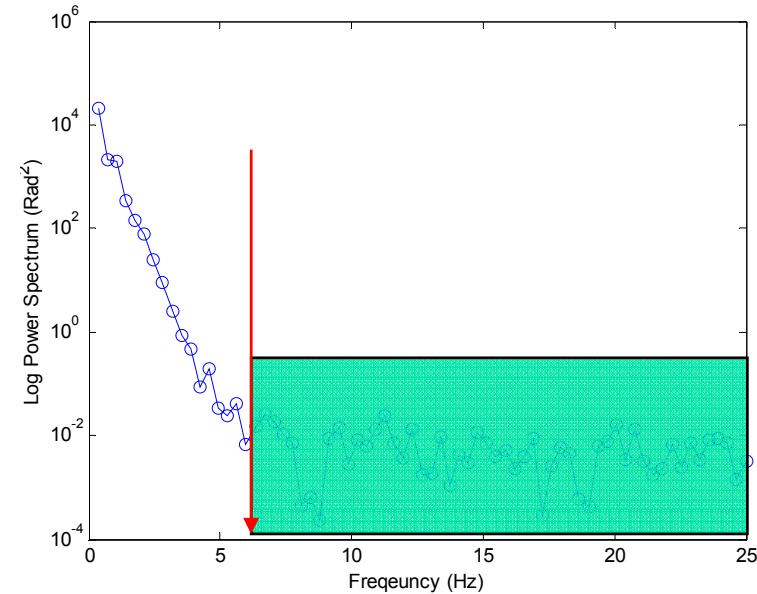
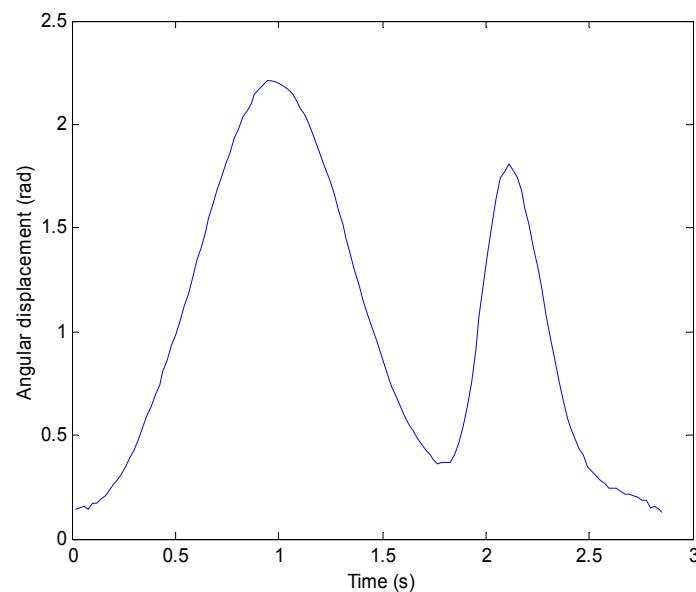
## Problems

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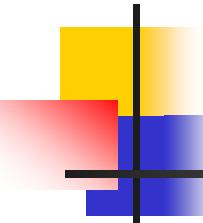
- Selection of appropriate cut-off frequency
  - Differentiation process
  - Endpoint distortion
- 
- Signals are **non-stationary**



# Angular displacement of the elbow



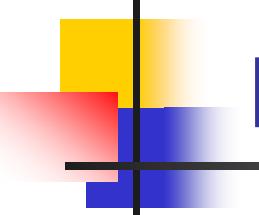
Georgakis, Stergioulas and Giakas, 2003



## Selection of cut-off

---

- Winter (1974)
- Hatze (1981)
- Woltring (1986)
- Dohrmann et al (1988)
- Damico and Ferrigno (1990)
- Simons and Yang (1991)
- Giakas and Baltzopoulos (1997a)
- Yu (1999)
- Challis (1999)
- Georgakis, Stergioulas and Giakas (2003)

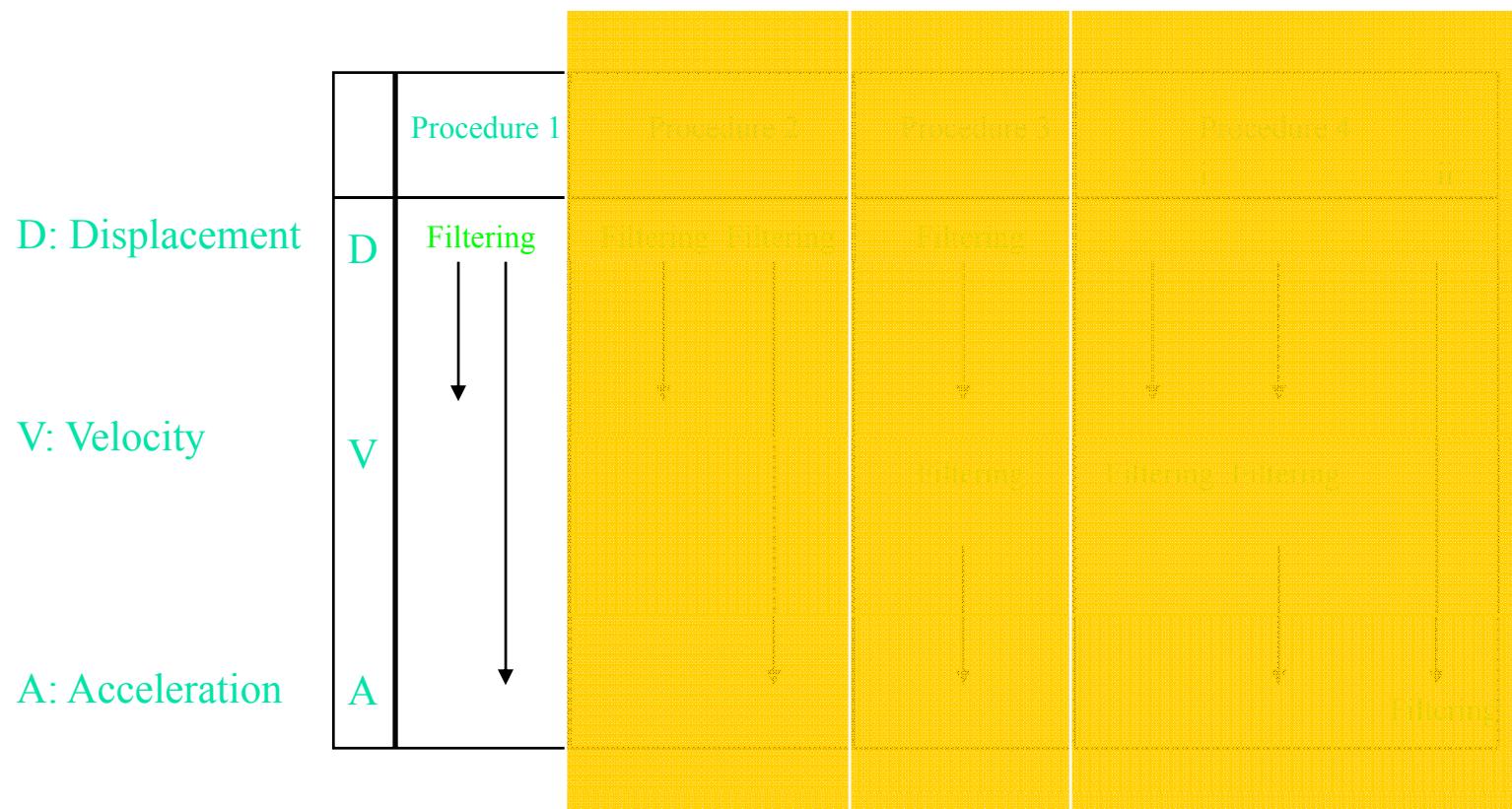


## Differentiation process

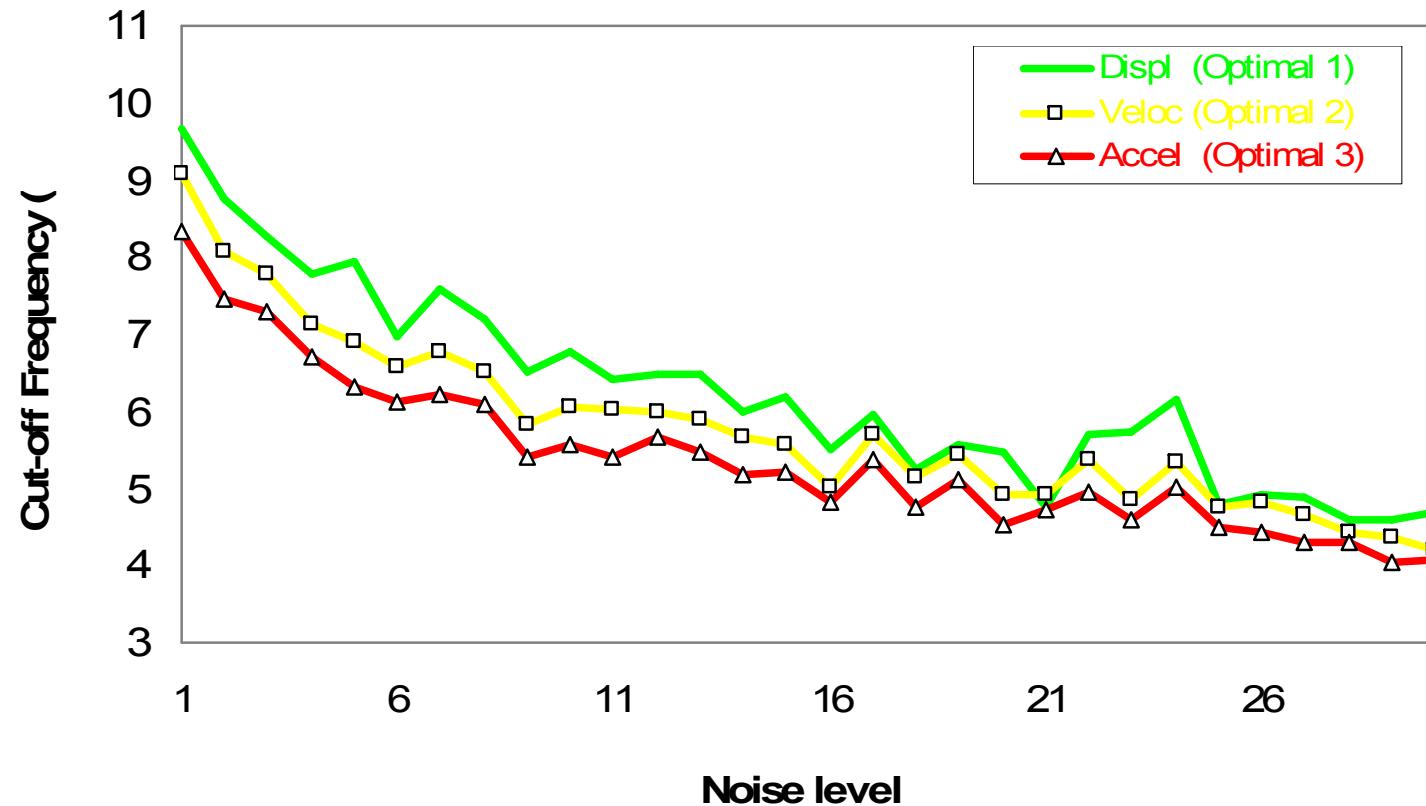
---

- The calculation of velocity and acceleration requires a different cut-off frequency applied to the displacement data (Hatze, 1981; Giakas and Baltzopoulos, 1997b)

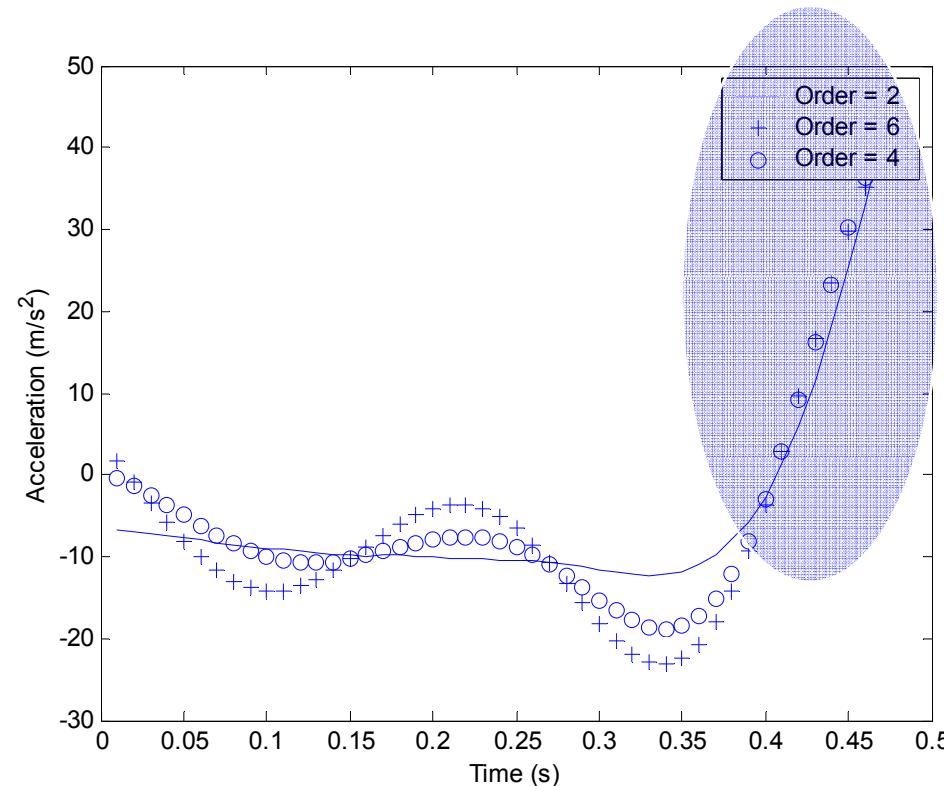
# Differentiation process



# Differentiation process



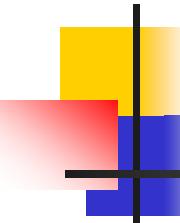
# Endpoint distortion



The signal is distorted at the edges when some filters are used

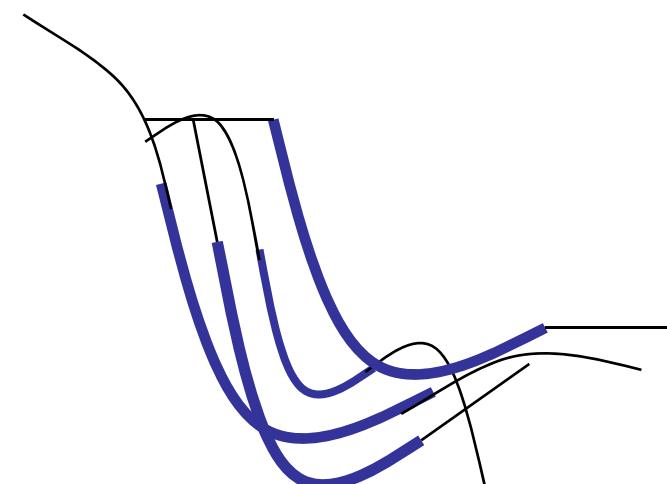


Vaughan 1982

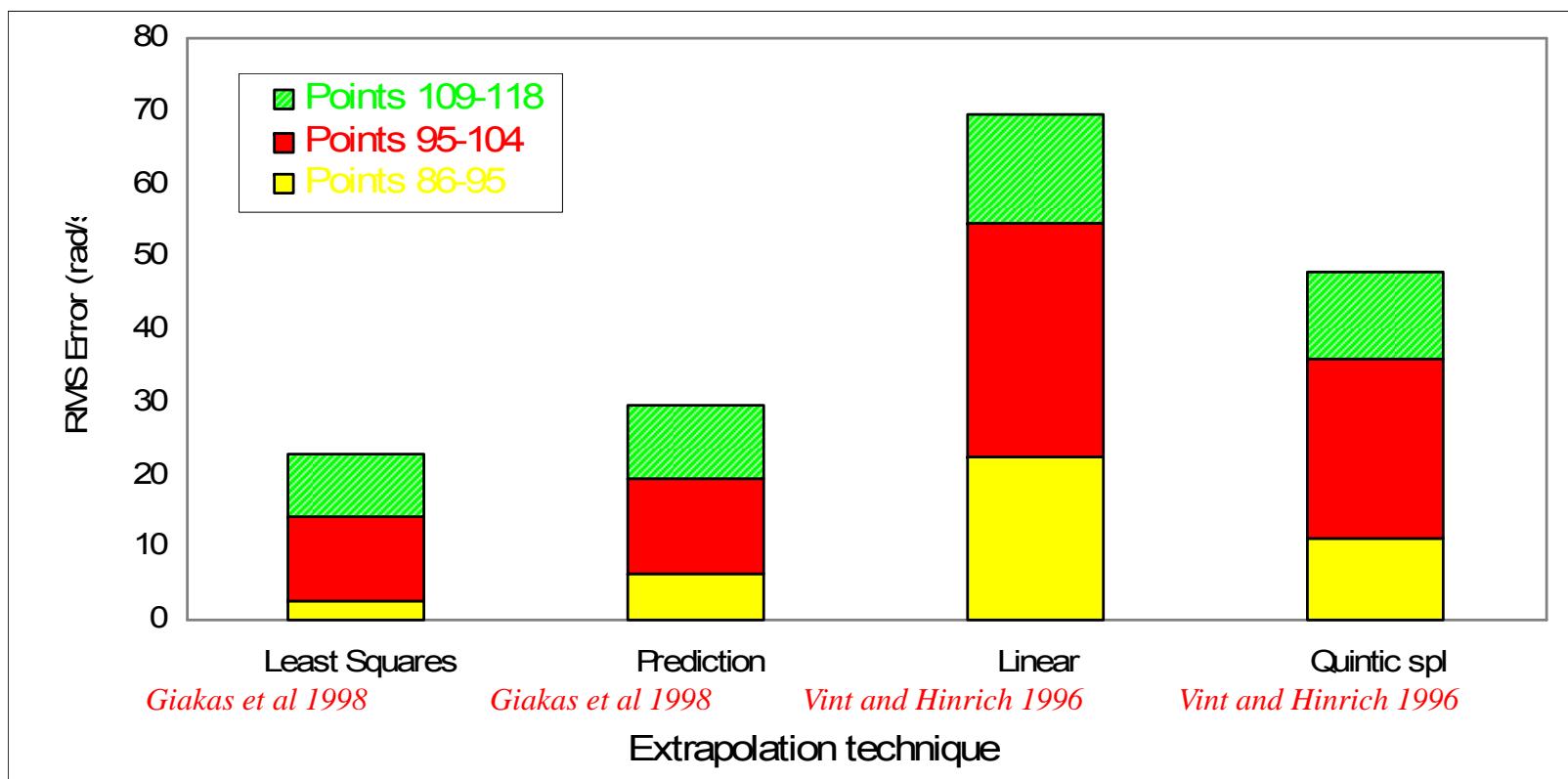


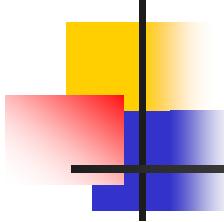
## Endpoint distortion

- Smith (1989)
- Vint and Hinrichs (1996)
- Giakas et al (1998)



# Endpoint distortion

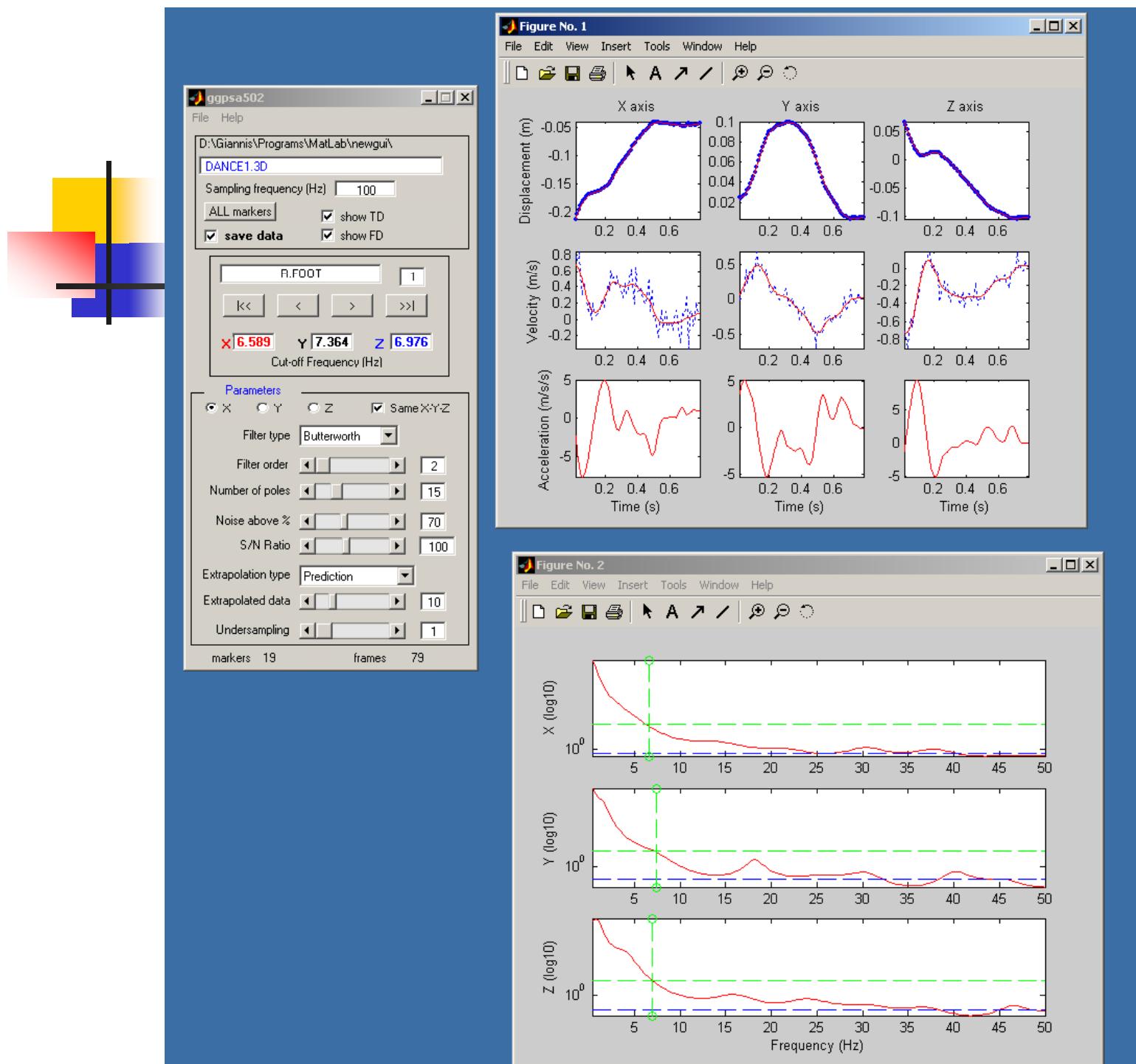


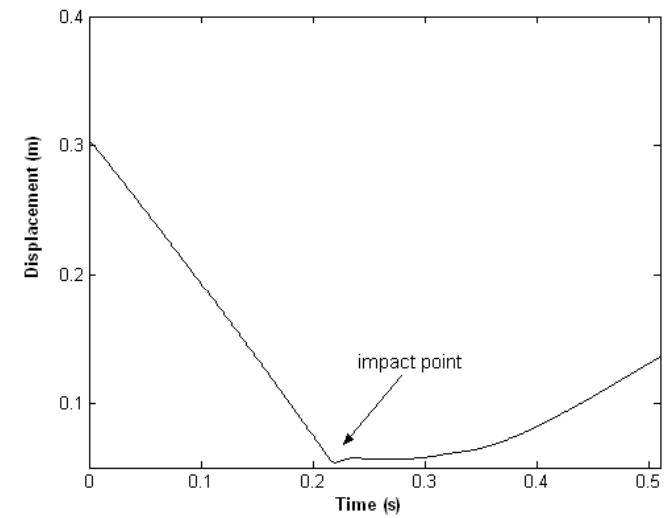
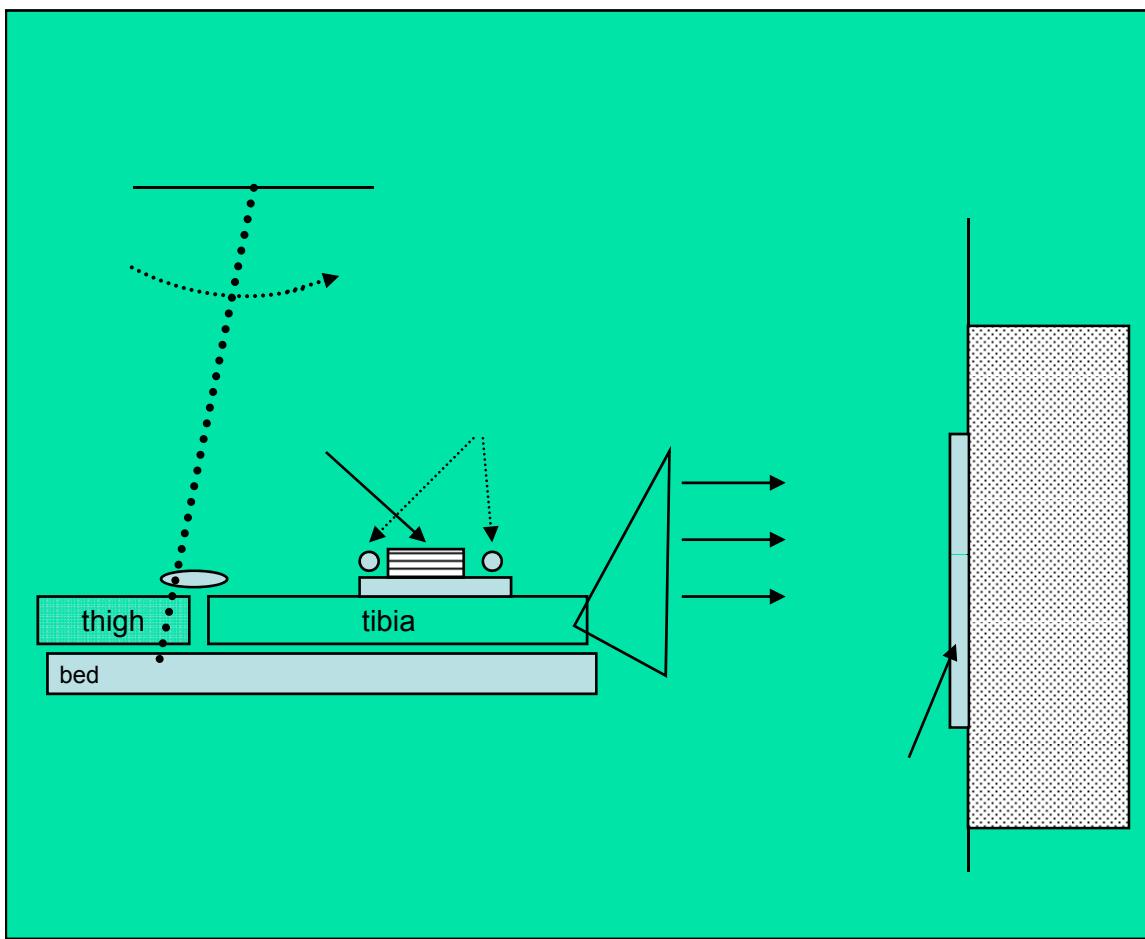


## Fundamentals

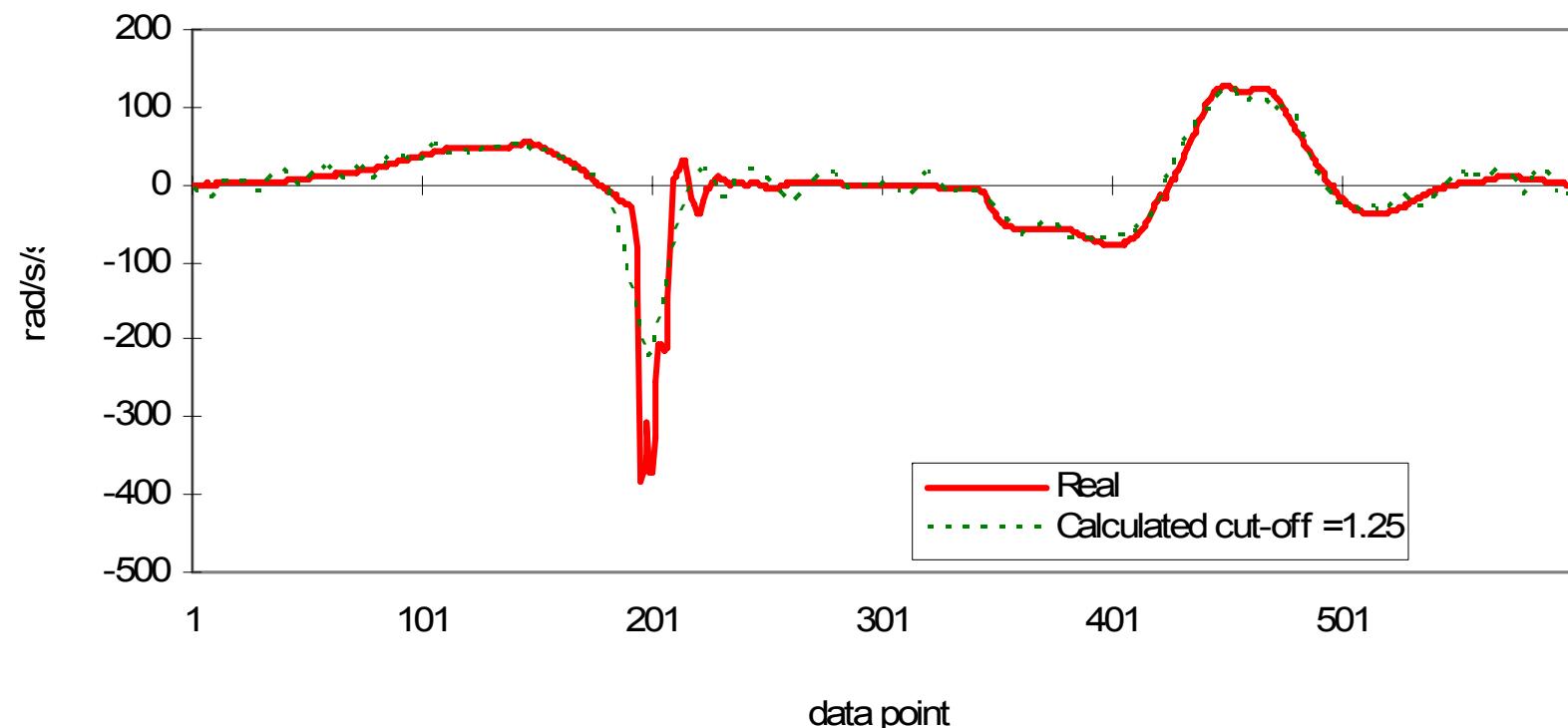
---

- Every single point requires a different cut-off frequency
- Every axis (of the same point) requires a different cut-off frequency
- Different data collection settings require adjustment of the filtering parameters

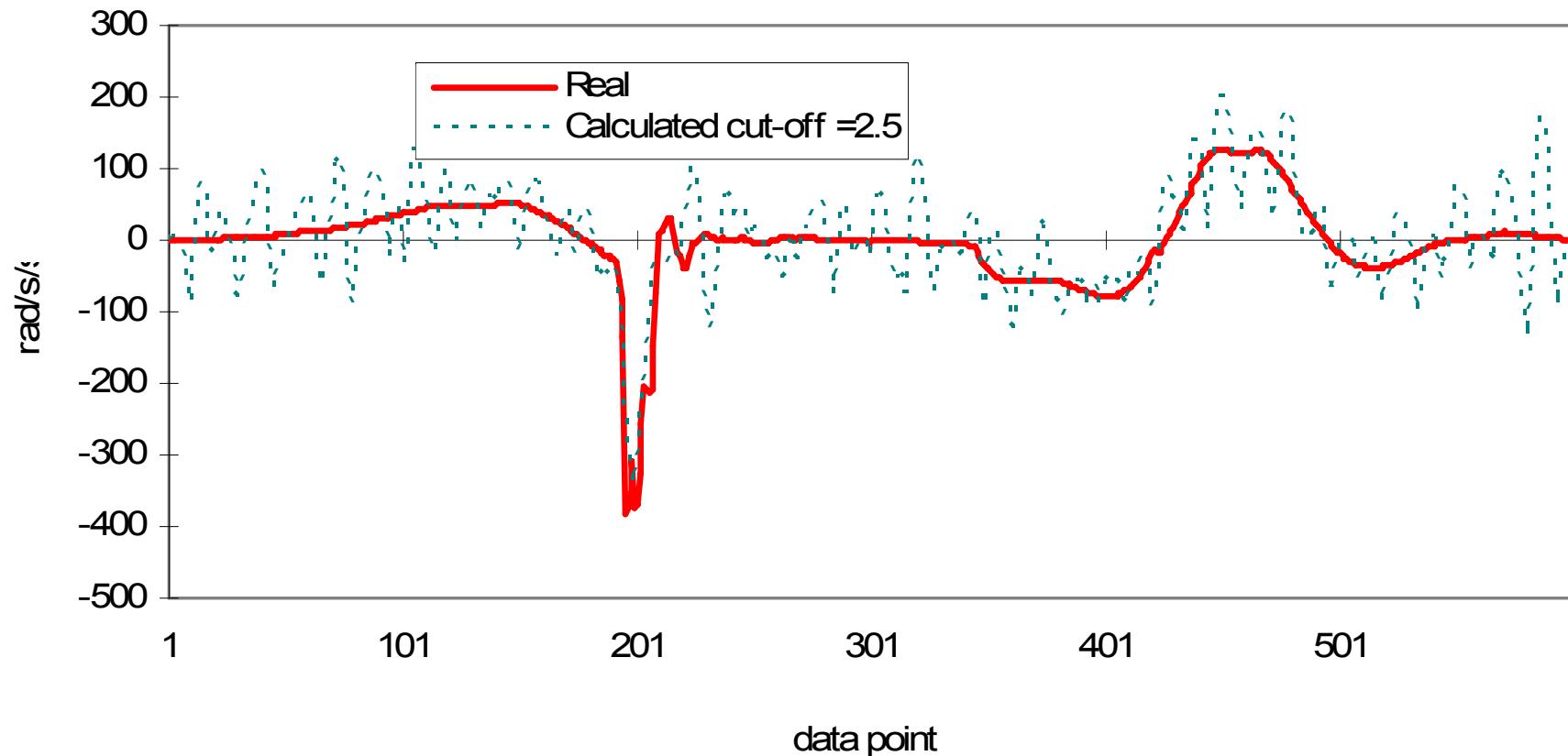


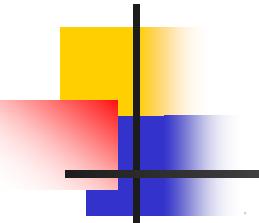


# Signals are non stationary

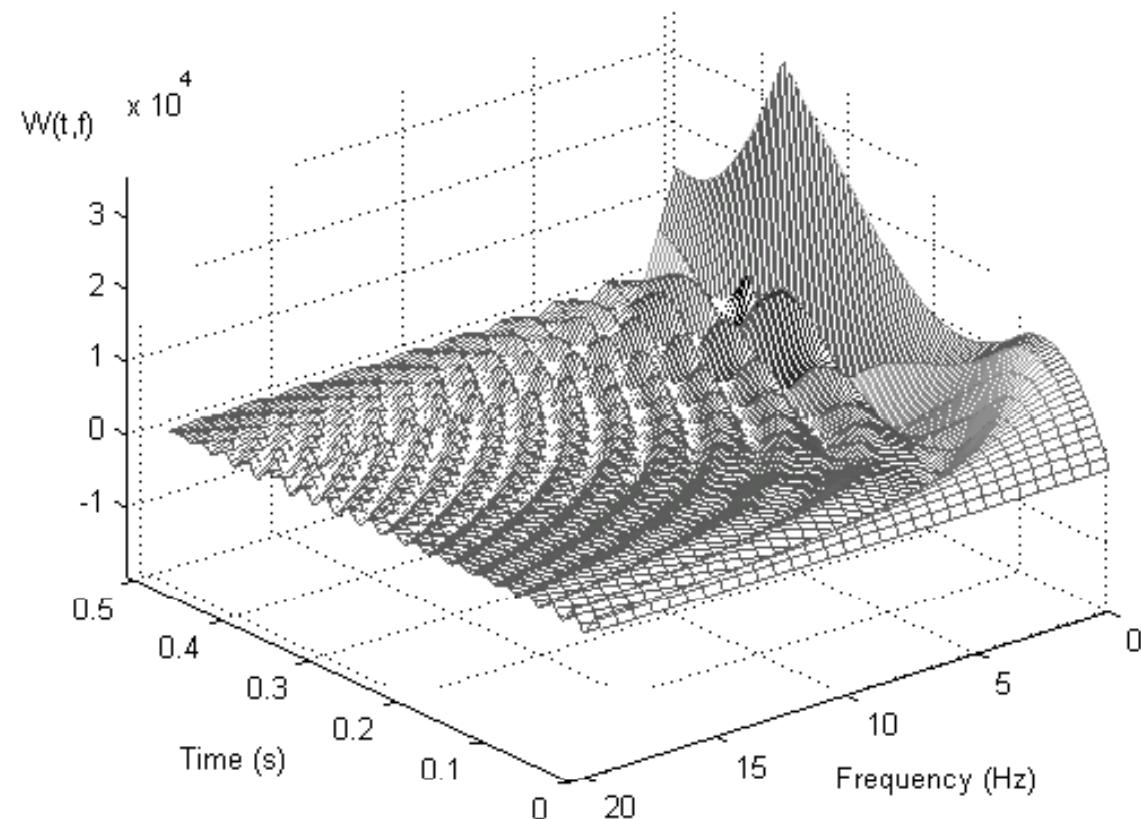


# Signals are non stationary

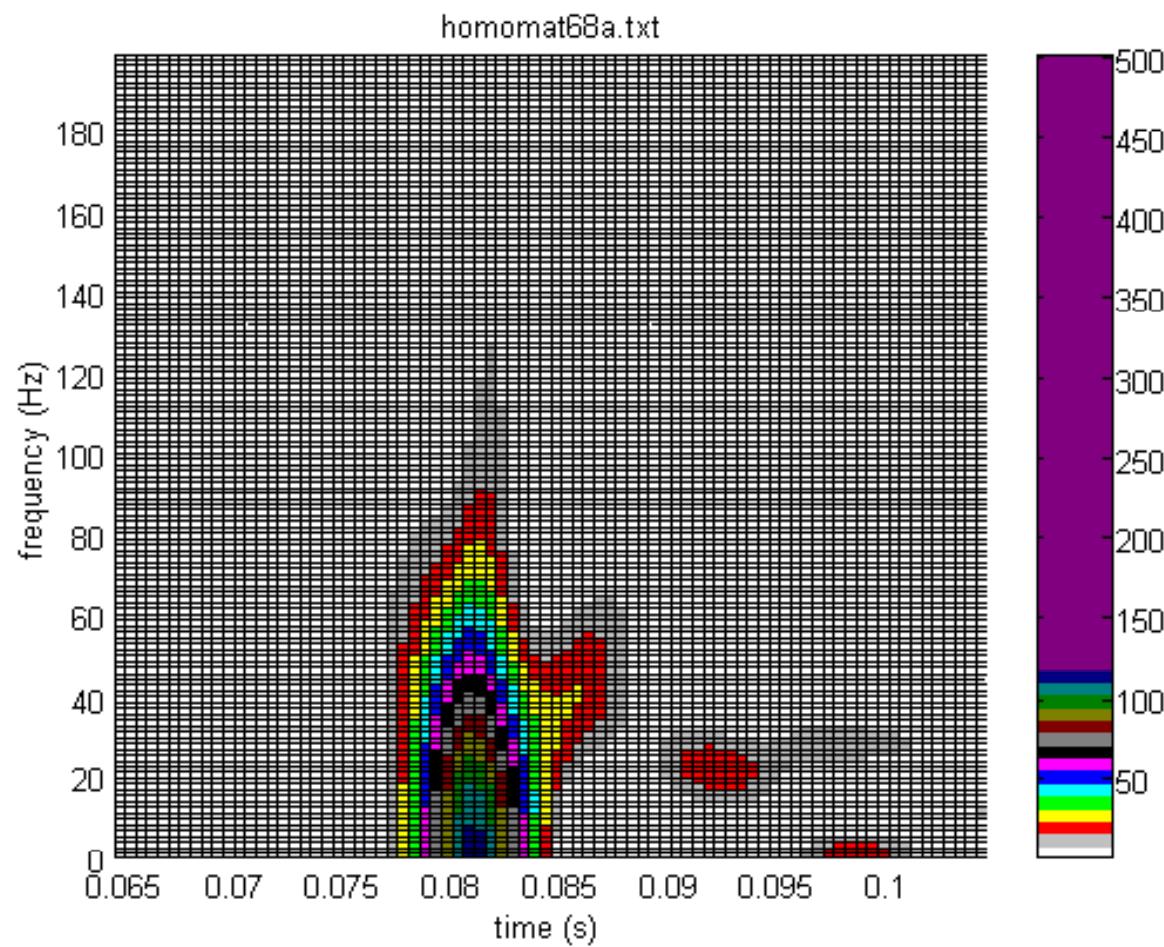


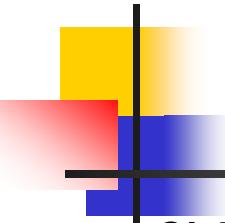


# Joint time frequency analysis



# Signals are non stationary





## References

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