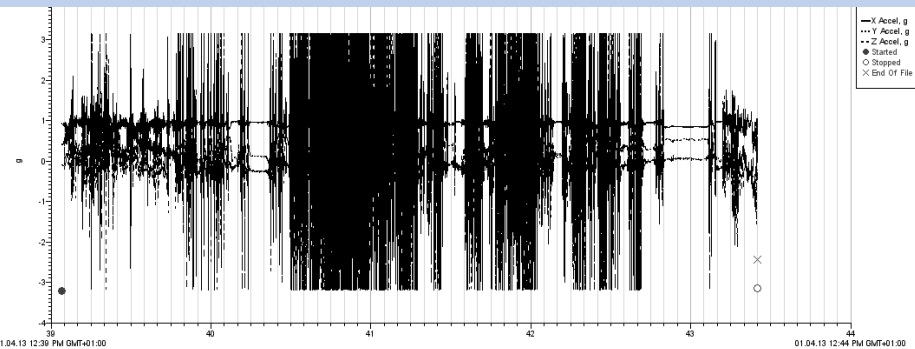




# ***USAGE OF TRI-AXIAL ACCELERATION OF THE HIND LEG FOR RECOGNIZING SHEEP BEHAVIOR***



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# Varieties of hind leg position and locomotion:

## *POSTURE*



**LAYING**



**STANDING**

# Varieties of hind leg position and locomotion:

## *GAIT TYPES*



**WALKING**

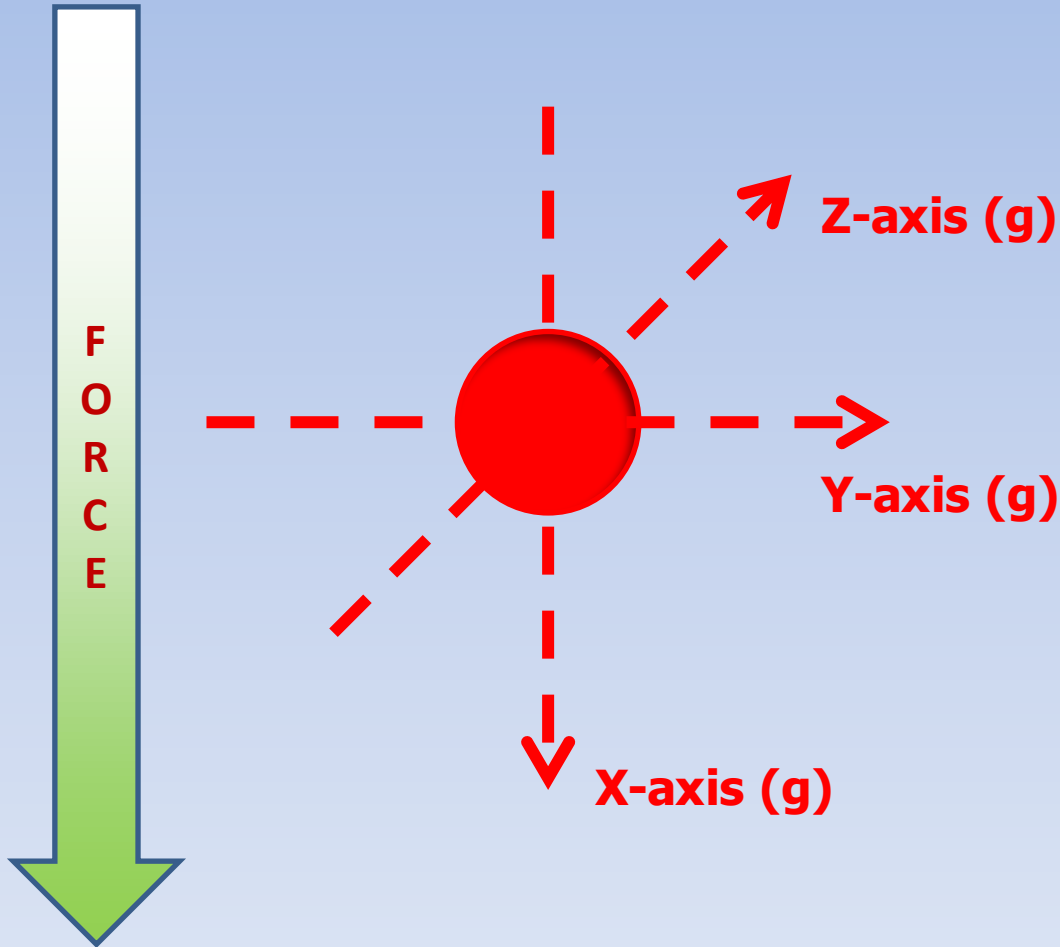


**RUNNING**



**TROTTING**

# Tri-axial accelerometers – Operating principles



Axis acceleration equation:

$$x = \cos(180 - x)$$

Sum vector acceleration:

$$\text{Sum vector} = \sqrt{x^2 + y^2 + z^2}$$

Accel  
erom  
eter

$$x = 1g; y = 0$$

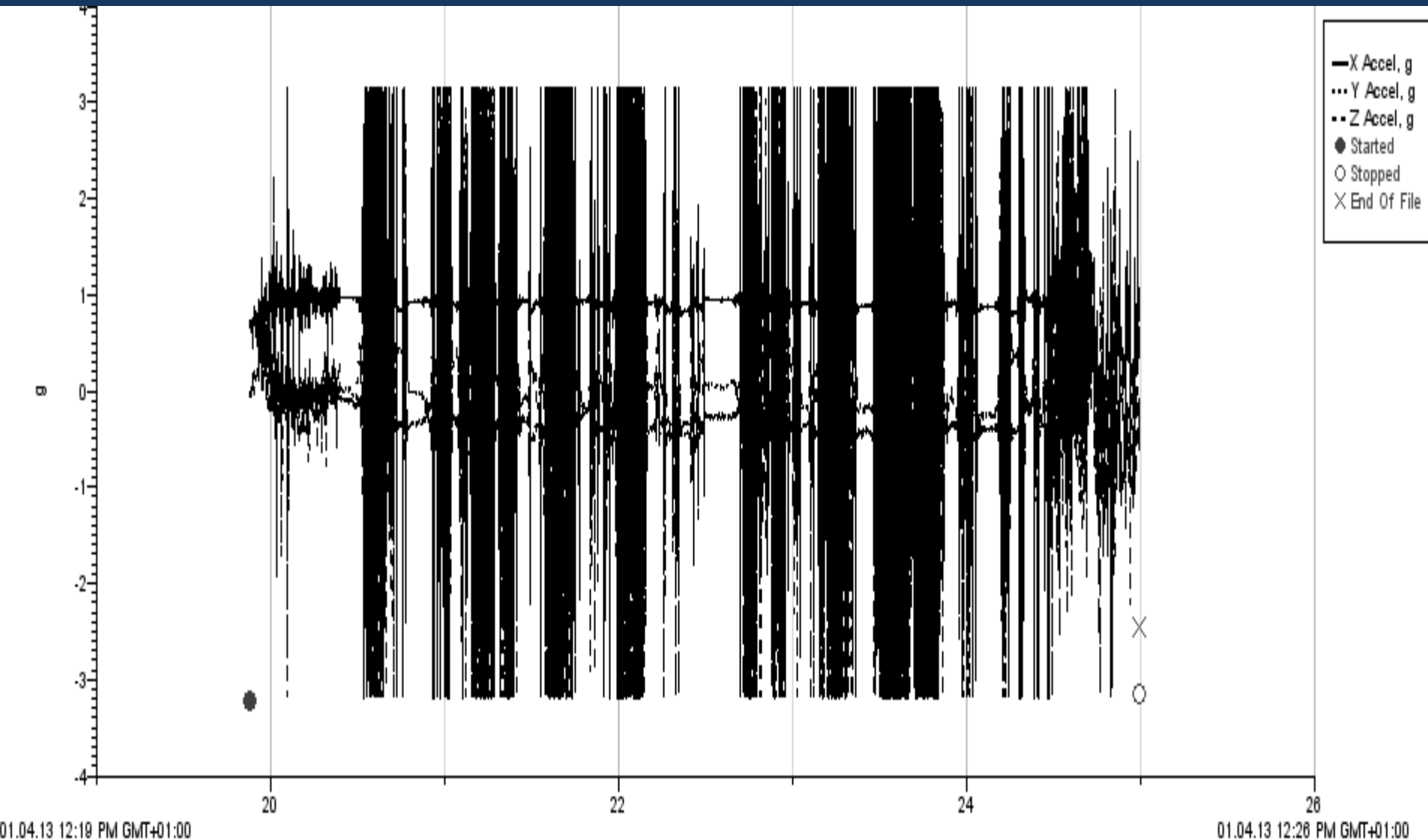
$$x = -1g; y = 0$$

Accelerometer

$$x = 0g; y = 1$$

$$x = 0g; y = -1$$

# Attaching accelerometer on the animal:



# Objectives

- Interpretation of gathered data from the accelerometer attached on the hind leg of sheep
- Optimized method for discrimination of:
  - Posture (standing & lying)
  - Gait type (walking, trotting & running)
- Stride models and kinematic parameters for walking & running



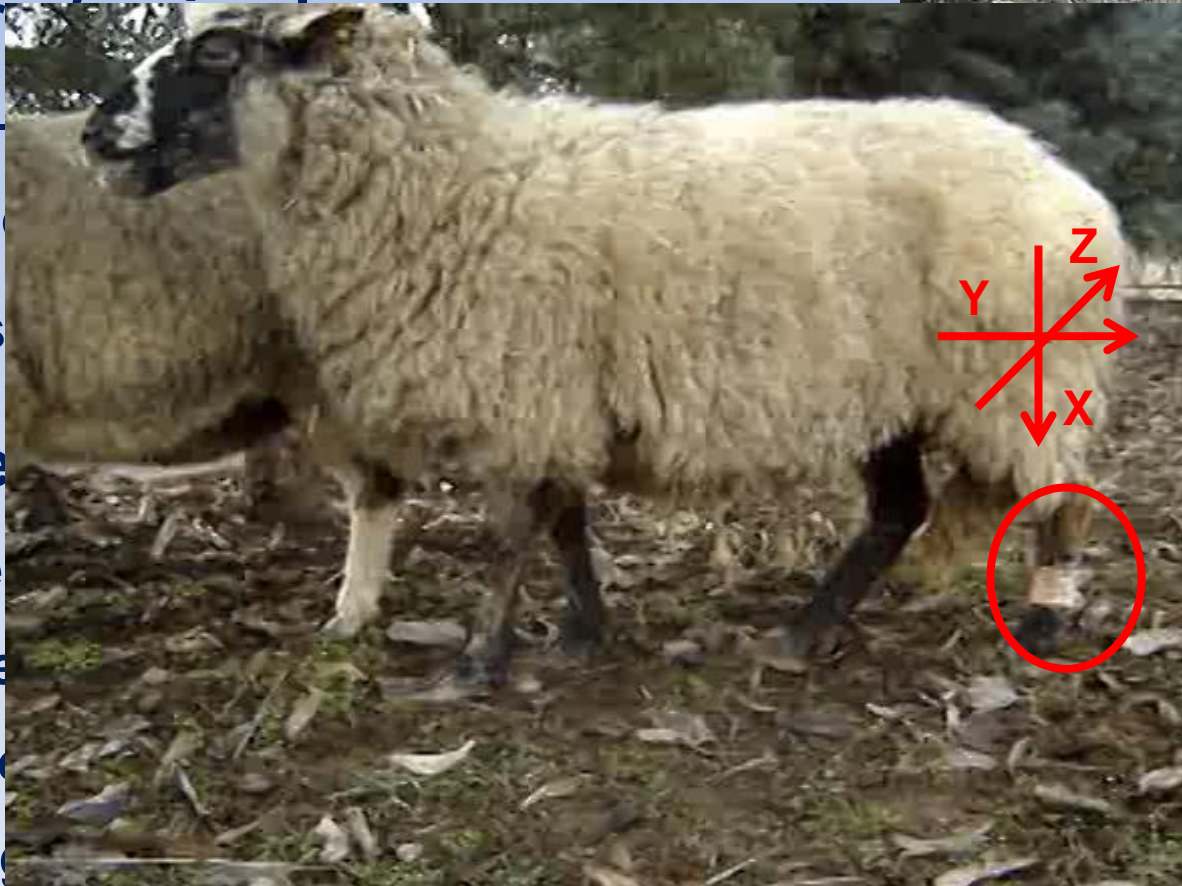
# Animals & Accelerometers

## ➤ Number of activities

- Standing – 1 s
- Gait – 6 s
- Lying – 7 s

## ➤ Accelerometers

- HOBO Pendant
- Logger set
  - record
  - log



0.03s(33Hz)  $\approx$  100 readings/3 seconds (max. duration of 10 min.)

# Video & Software

## ➤ **Video recording:**

SONY DSC – S90 camera 25 frames/ s

## ➤ **Software:**

HOBOWare Lite® 3.3.3– reading out logger data

Adobe Premiere Pro CS5.5 ® - video analysis

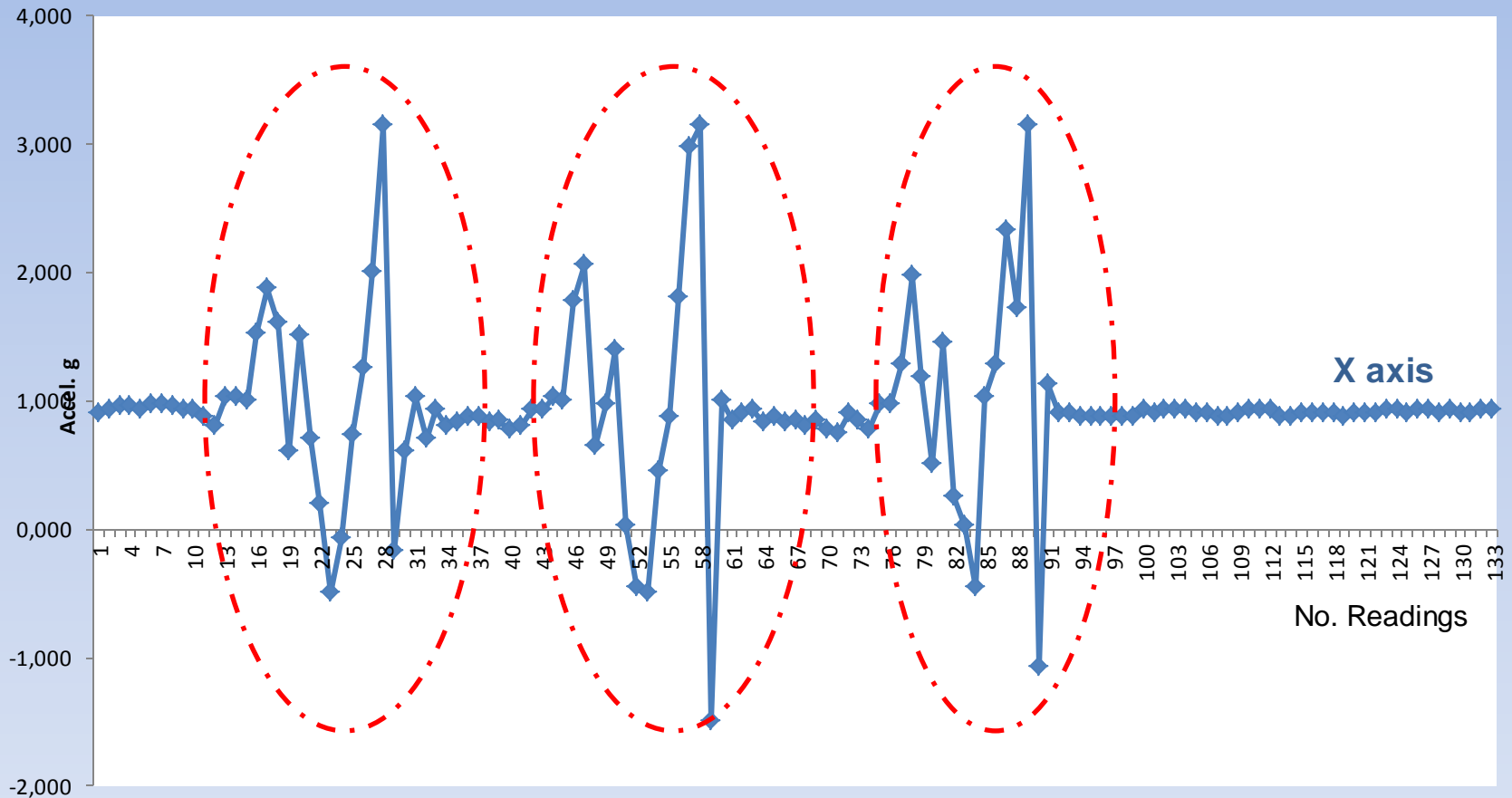
MS Excel 2010 & STATISTICA 8.0 - data processing



# Summary of gathered data

	<b>Total time (s)</b>	<b>Acc. readings</b>	<b>No. of sequences</b>	<b>Mean <math>\pm</math> SD time (s) /sequence</b>
<b>Lying</b>	<b>1,800</b>	<b>7,784</b>	<b>6</b>	<b>637.8 <math>\pm</math> 511.8</b>
<b>Standing</b>	<b>268.9</b>	<b>8,872</b>	<b>6</b>	<b>44.8 <math>\pm</math> 20.60</b>
<b>Walking</b>	<b>102.4</b>	<b>3,402</b>	<b>13</b>	<b>7.9 <math>\pm</math> 5.9</b>
<b>Trotting</b>	<b>78.0</b>	<b>2,595</b>	<b>19</b>	<b>4.1 <math>\pm</math> 1.39</b>
<b>Running</b>	<b>83.8</b>	<b>2,787</b>	<b>18</b>	<b>4.7 <math>\pm</math> 3.78</b>

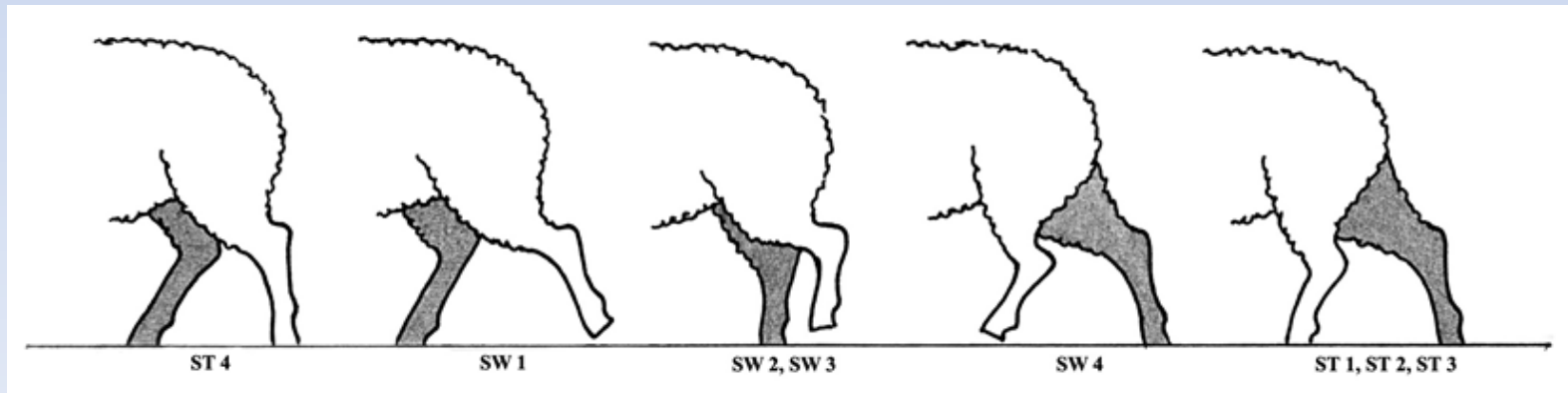
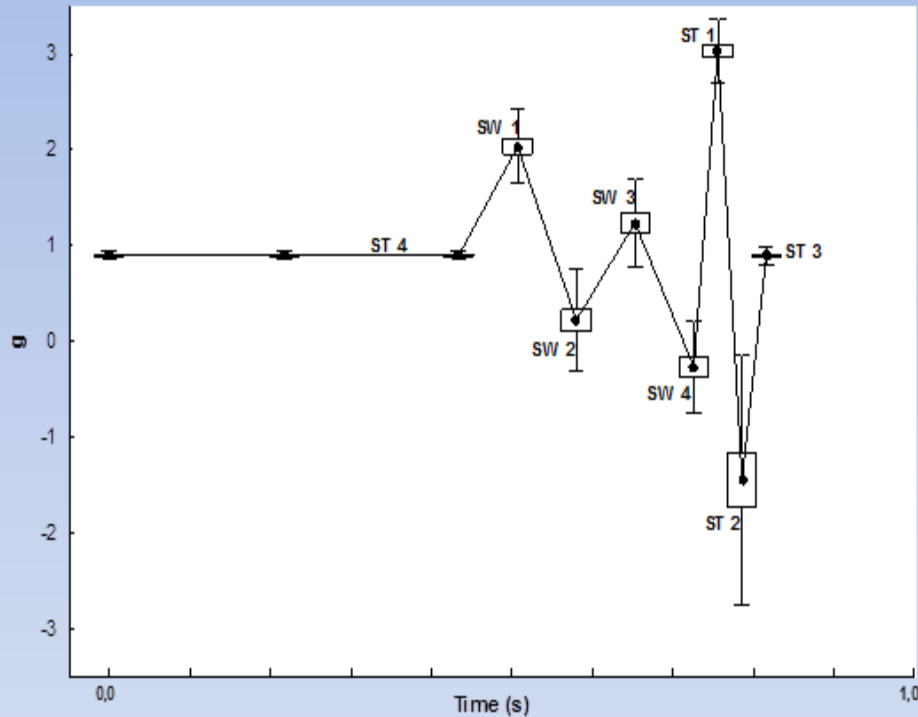
# Single Stride analysis - WALKING



- 94 stride patterns on the vertical (x) axis
- 8 key acceleration points (KAP)

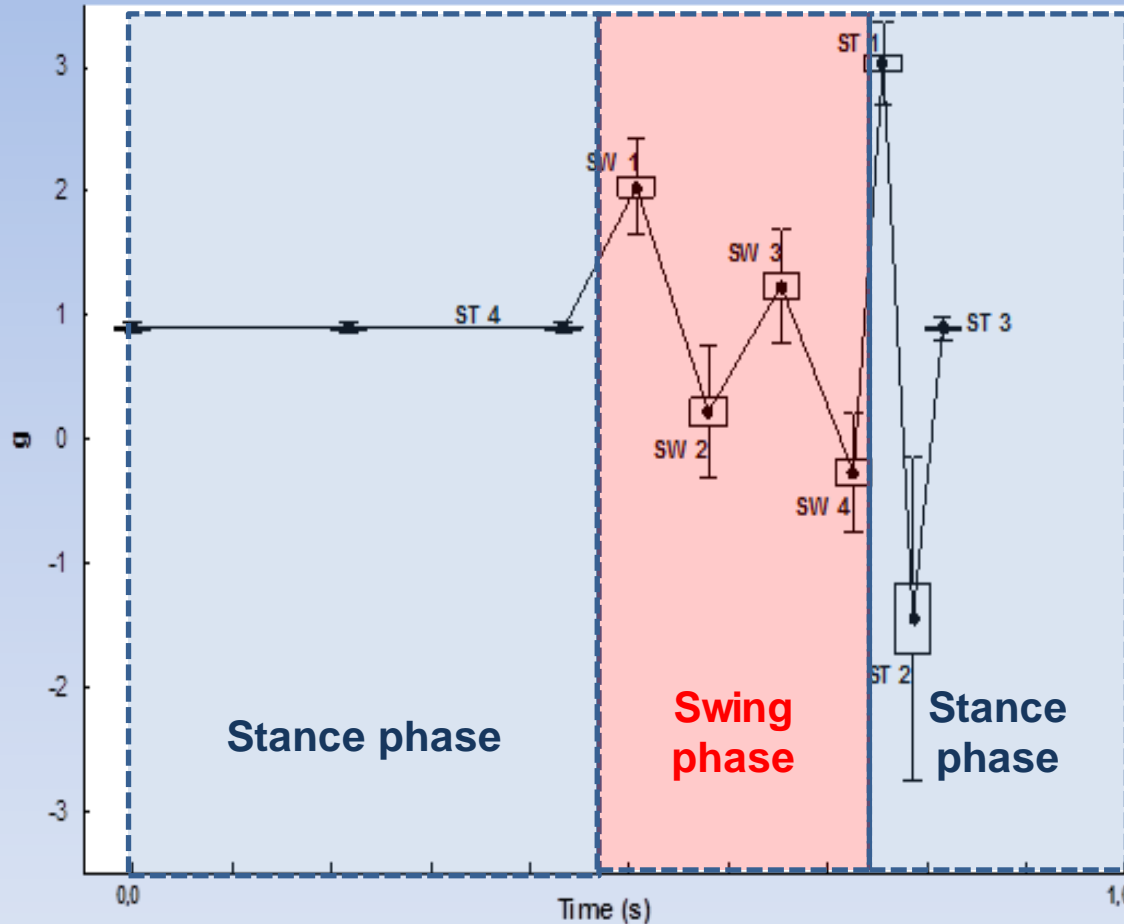
# Single Stride analysis – WALKING

## *Stride Acceleration Model*



# Single Stride analysis – WALKING

## *Kinematic stride parameters*



$$ST_{(tw)} = ST4_{(ts)} - SW4_{(ts-1)}; ST_{(tw)} = ST4_{(ts)} - (SW4_{(ts-1)} + 0.03) , \text{if } SW4_{(ts-1)} + 0.03 \neq ST1_{(ts-1)}$$

$$SW_{(tw)} = SW4_{(ts)} - ST4_{(ts)}; SW_{(tw)} = (SW4_{(ts)} + 0.03) - ST4_{(ts)} , \text{if } SW4_{(ts)} + 0.03 \neq ST1_{(ts)}$$

# Single Stride analysis – WALKING

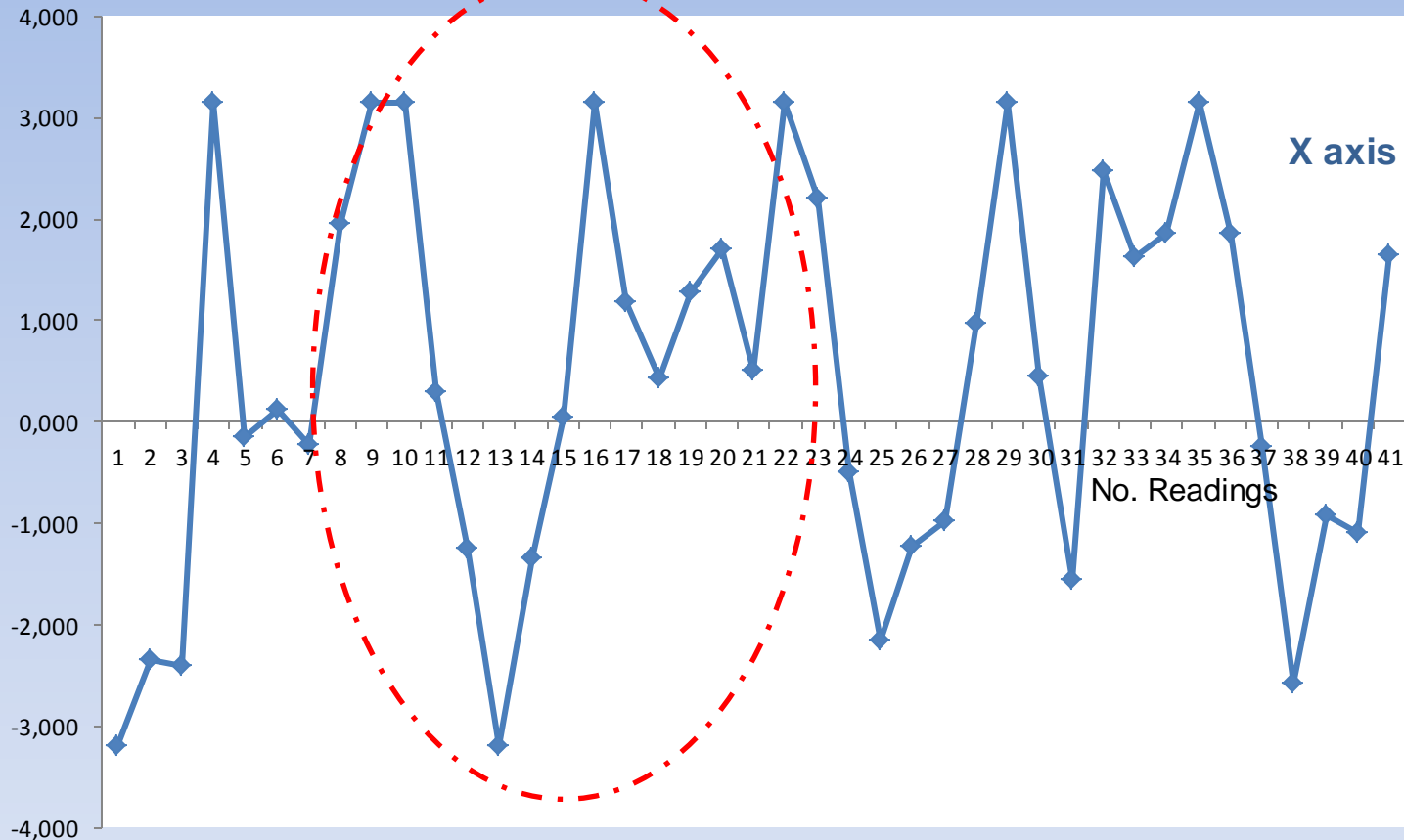
## *Kinematic stride parameters*

	Walking			
	Total strides (n)	Mean $\pm$ SD	Range	CI 95%
Stance phase (s)	77	0.52 $\pm$ 0.17	0.24 – 1.20	0.48 – 0.56
Swing phase (s)	77	0.29 $\pm$ 0.06	0.18 – 0.45	0.28 – 0.31
Stride duration (s)	77	0.81 $\pm$ 0.19	0.42 – 1.53	0.77 – 0.86
Duty factor (%)	77	63.30 $\pm$ 6.98	44.44 – 80.00	61.71 – 64.88

➤ % error of number of strides comparing with the video of 2%(7% - 33%)



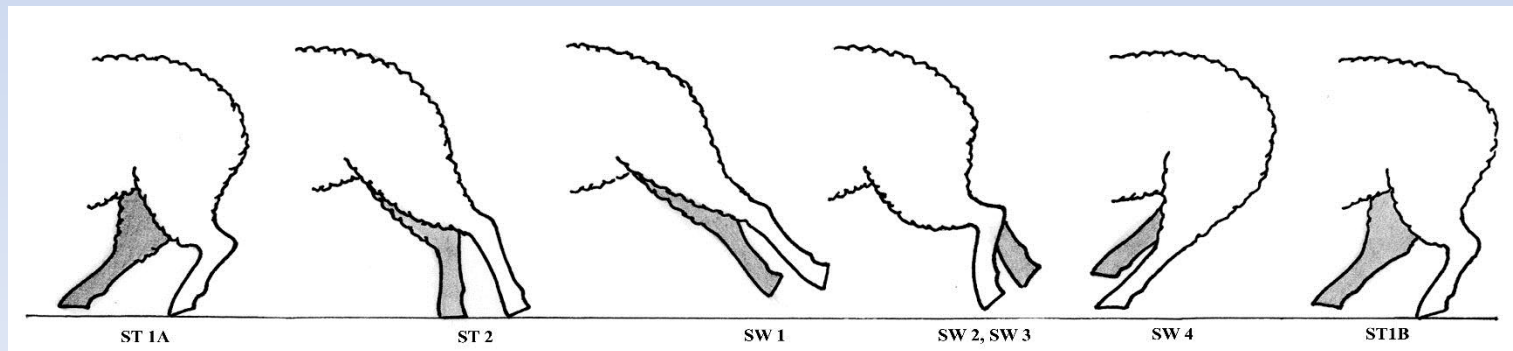
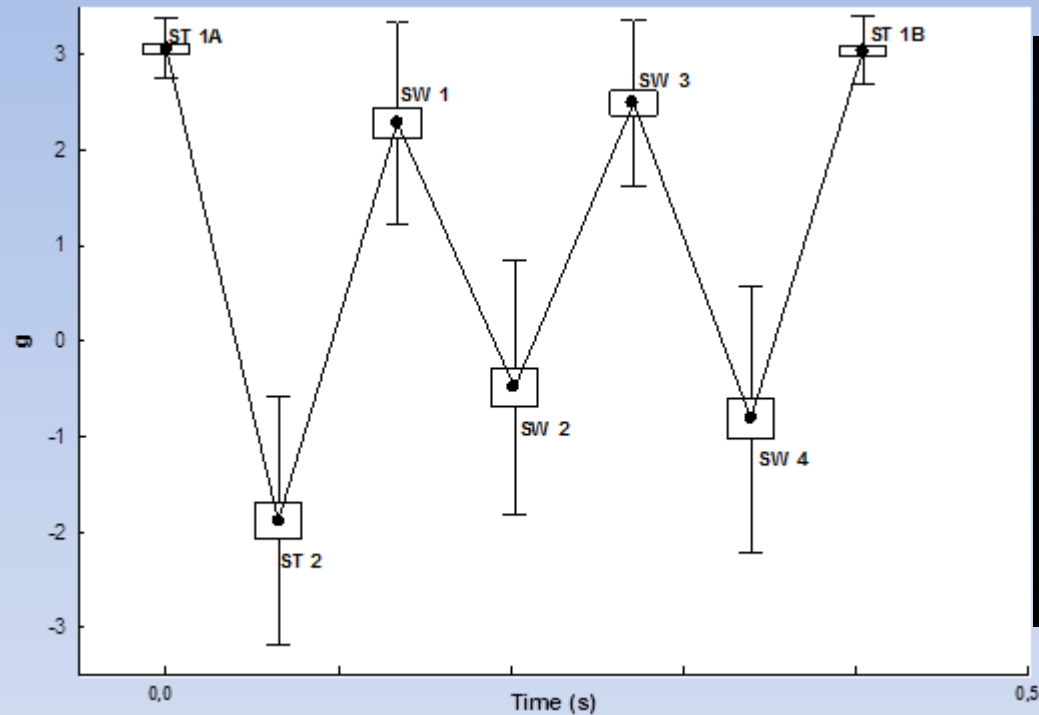
# Single Stride analysis - RUNNING



- **180 stride patterns on the vertical (x) axis**
- **7 key acceleration points (KAP)**

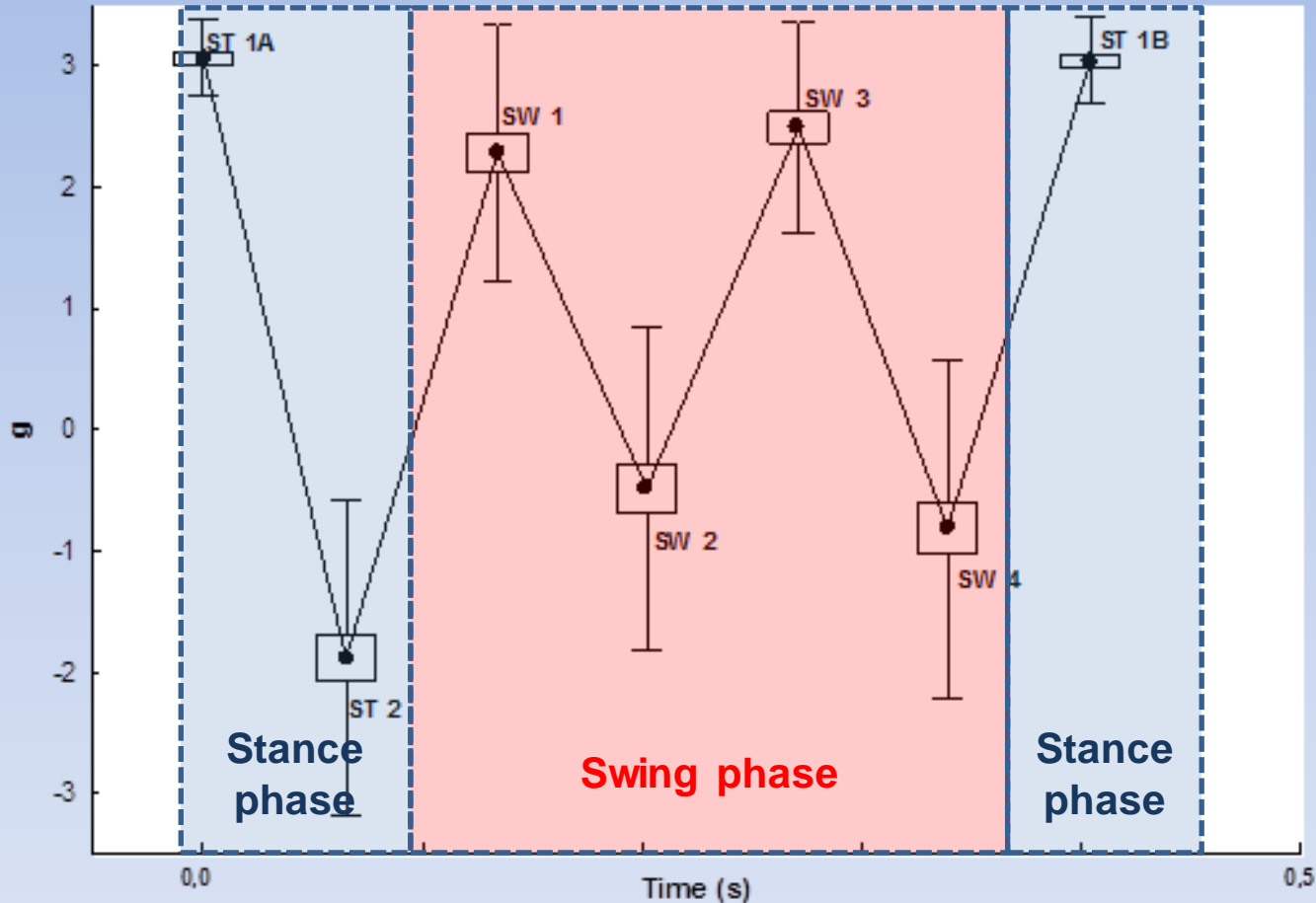
# Single Stride analysis – RUNNING

## *Stride Acceleration Model*



# Single Stride analysis – RUNNING

## *Kinematic stride parameters*



$$ST_{(tr)} = ST2_{(ts)} - SW4_{(ts-1)}; \quad ST_{(tr)} = ST2_{(ts)} - (SW4_{(ts-1)} + 0.03), \text{ if } SW4_{(ts-1)} + 0.03 \neq ST1A_{(ts)}$$

$$SW_{(tr)} = SW4_{(ts)} - ST2_{(ts)}; \quad SW_{(tr)} = (SW4_{(ts)} + 0.03) - ST2, \text{ if } SW4_{(ts)} + 0.03 \neq ST1B_{(ts)}$$

# Single Stride analysis – RUNNING

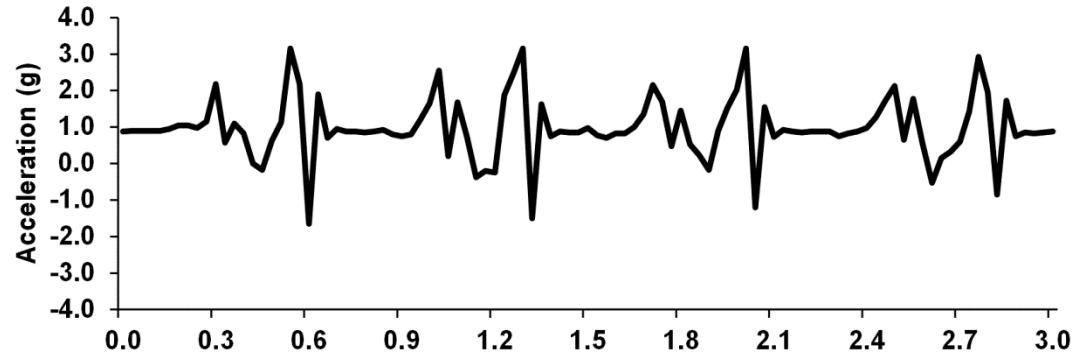
## *Kinematic stride parameters*

	Running			
	Total strides (n)	Mean $\pm$ SD	Range	CI 95%
Stance phase (s)	161	0.13 $\pm$ 0.05	0.06 – 0.27	0.12 – 0.14
Swing phase (s)	161	0.27 $\pm$ 0.08	0.12 – 0.48	0.26 – 0.29
Stride duration (s)	161	0.40 $\pm$ 0.08	0.21 – 0.69	0.39 – 0.42
Duty factor (%)	161	32.51 $\pm$ 10.42	12.50 – 66.67	30.89 – 34.13

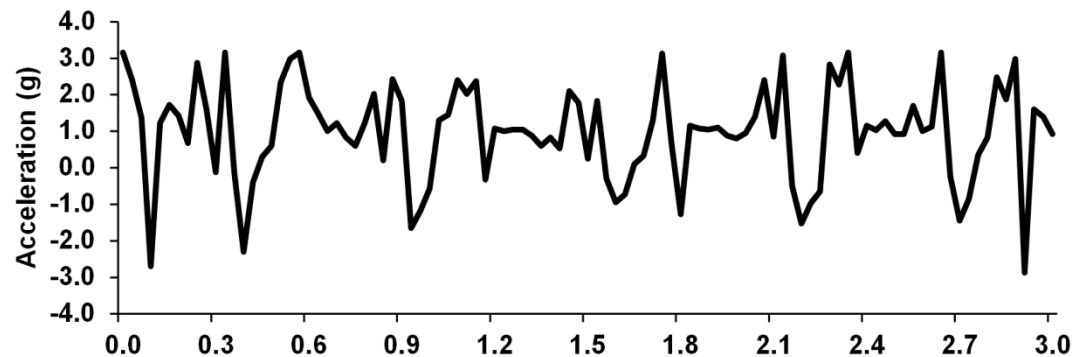
➤ % error of number of strides comparing with the video of 1%(9% - 33%)

# Gait discrimination

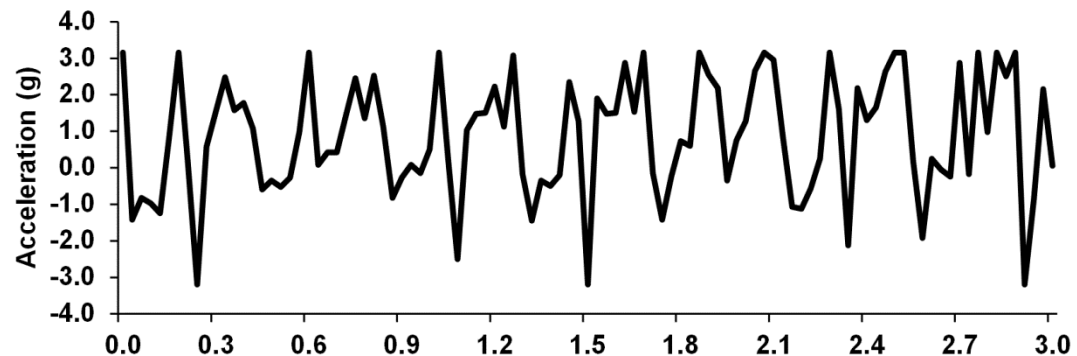
➤ Walking



➤ Trotting



➤ Running





# Gait discrimination

Sequences for walking, trotting & running



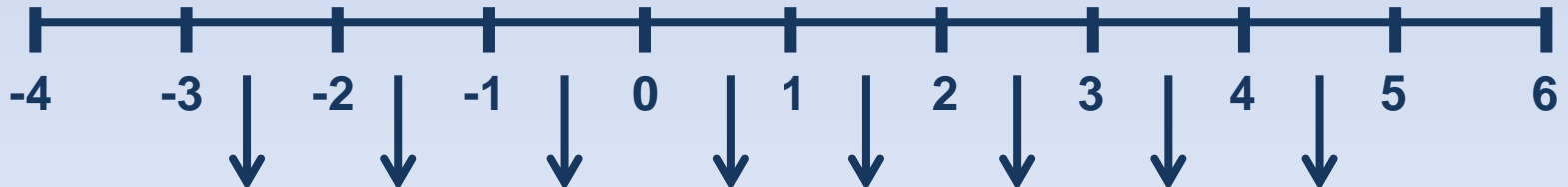
77 Epochs – 3 sec. periods  $\approx$  100 acceleration readings



Acceleration values



Acceleration categories



Relative frequencies of acceleration categories (RFAC)

# Gait discrimination

- Discriminant function of RFAC for the vertical, horizontal axes & Sum vector

	Acceleration Categories				
Vertical (x) axis	0 - 1	1 - 2	2 - 3	-3 – (-2)	
Horizontal (y) axis	3 - 4	2 - 3	-4 – (-3)	-2 – (-1)	-2 – (-1)
Sum Vector	0-1	2 - 3	5 - 6	1 - 2	3 - 4

# Gait discrimination

## ➤ Classification function

$$S_g = c_g + w_{gAC1} * rf_{AC1} + w_{gAC2} * rf_{AC2} + .....w_{gACm} * rf_{ACm}$$

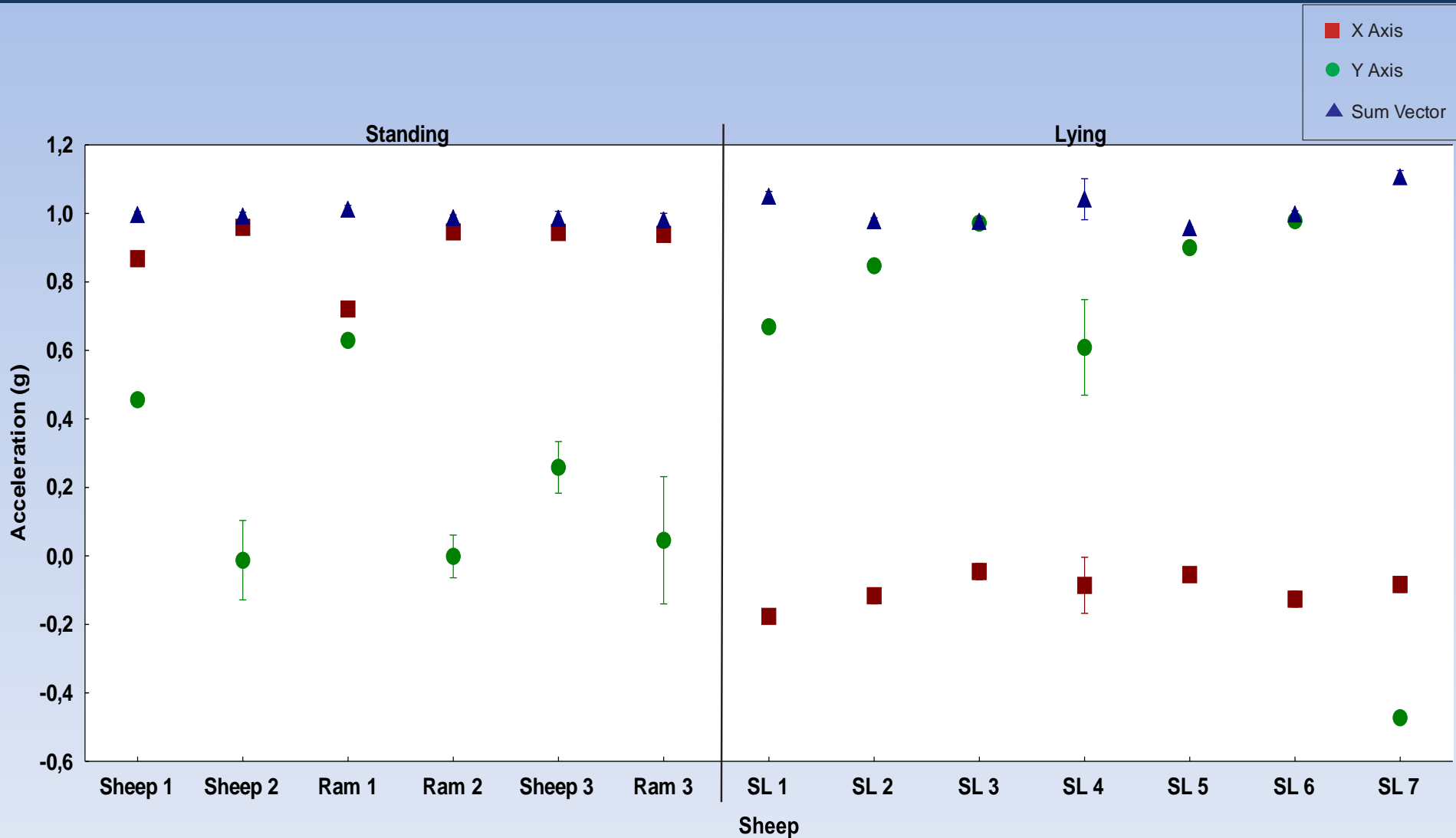
## ➤ Post hock classification matrix

- Vertical axis – correct cases 89.6%
- Horizontal axis – correct cases 90.9%
- Sum vector – correct cases 87.0%
- Trotting - least ; Walking – most accurate

## ➤ Optimized method for gait discrimination:

- using one axis and 4 or 5 AC identifies the gait type

# Standing vs Lying



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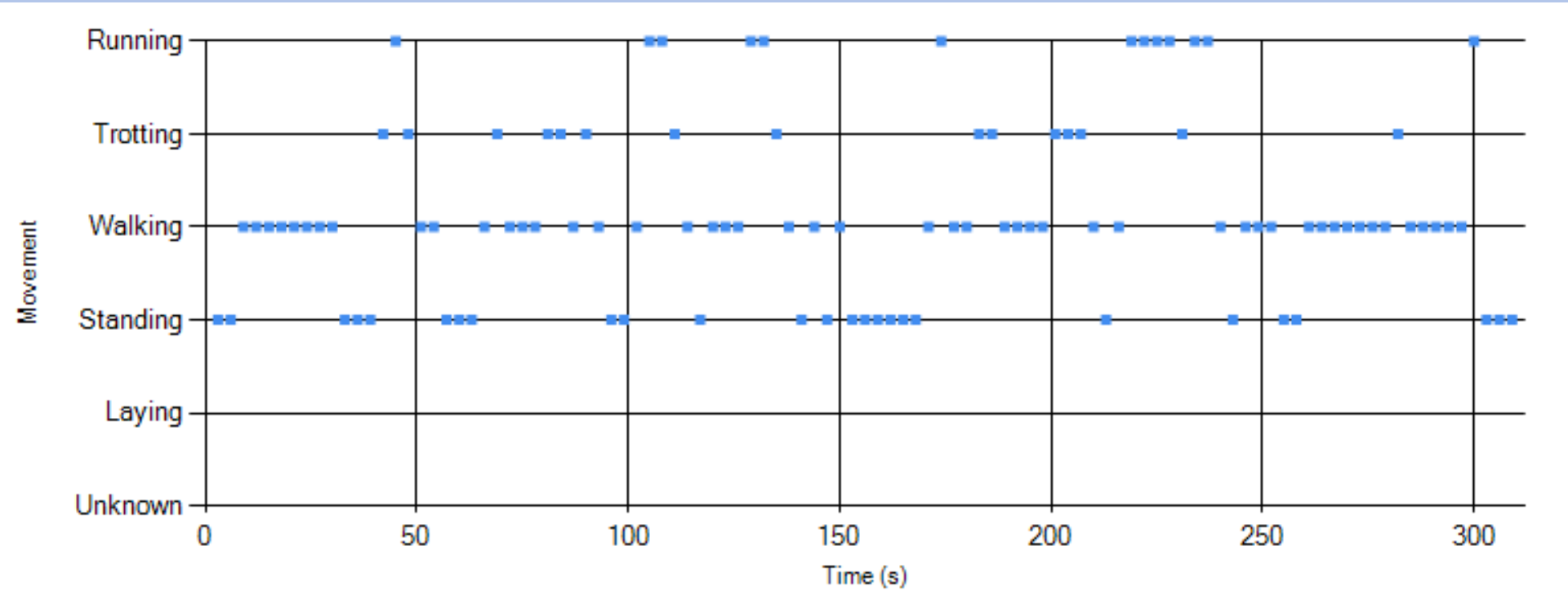
## SIMULATION EXAMPLE – ONLY FOR TESTING

No file chosen

If you don't have sample file, [Click here to DOWNLOAD sample Sheep1.txt file for testing the algorithm](#)



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