

# **Motion Cyclification** **by** **Time x Frequency Warping**

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# Presentation Outline

- Motion Processing
- Motion Re-timing
- Human Motion Cyclification
- Our Motivation
- Time x Frequency Warping of 1D Signals
- Cyclification of Articulated Figure Motion
- Video / Conclusions / Future Work

# Motion Processing

- Modification and reuse of animation parameters
- Examples
  - kinematic and dynamic parameters.
  - motion capture data.
- Strategy
  - signal processing techniques.

# Captured Data Processing

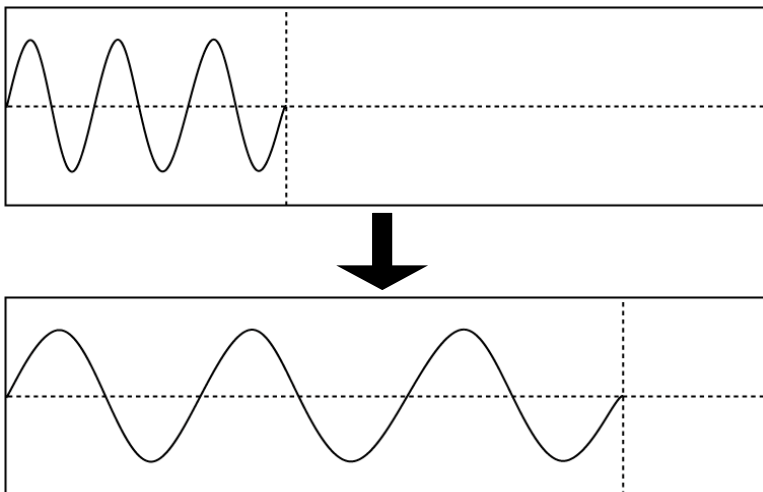
- Motion curves: positional and rotational values
  - sampling at joints of a real subject.
- Current techniques
  - filtering, transition, warping, blending.
- Motion re-timing
  - changes duration of motion (in time).
  - main applications: games, facial animation, ...

# Motion Re-timing

- Two different approaches

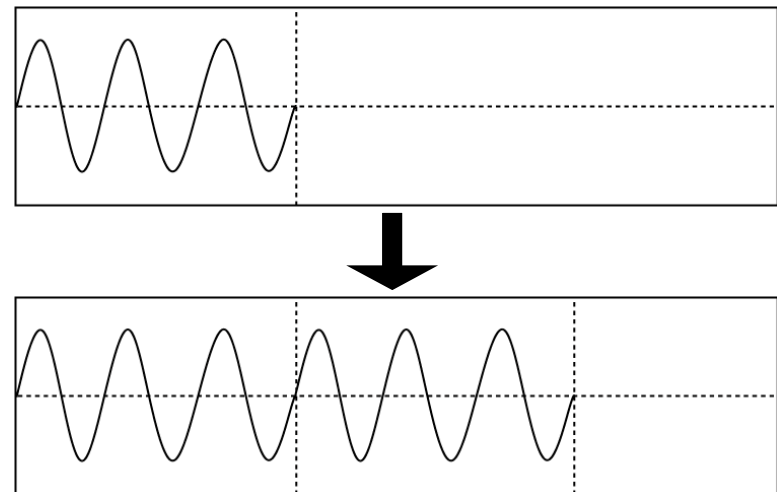
- reparametrization

- local resampling of motion curves  $\Rightarrow$  warping in time domain [Silva et al.98].
- frequency components are deformed  $\Rightarrow$  slow-motion and accelerated-time effects.



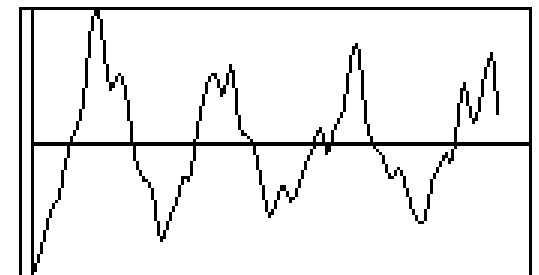
- cyclification

- detection and replication of motion cycles.
- current methods require user interaction and work well only for perfectly periodic motions.



# Human Motion Cyclification

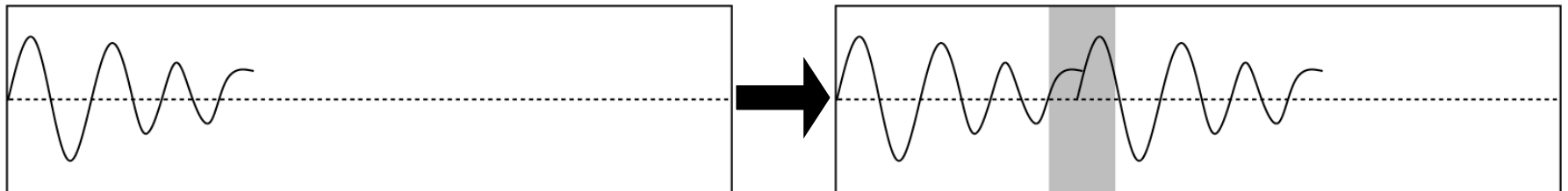
- Motion curves have a complex structure
  - *shape*: basic motion patterns (low frequencies).
  - *texture*: subtleties, detail and noise (high frequencies).
- Captured motion curves are not perfectly periodic
  - biomechanic and external factors introduce a noise component fundamental to natural-looking motion [Perlin95].
  - we call this class of motion as *near-periodic*.



motion captured joint curve  
(near-periodic signal)

# Detection of Motion Cycles

- Complicated analysis for *near-periodic* motions
  - requires user interaction [Cohen et al.96].
  - not suitable for real-time applications.
- Boundary discontinuity
  - happens during the transition between motion cycles.
  - smoothing methods are required [Sudarsky98].



# Our Motivation

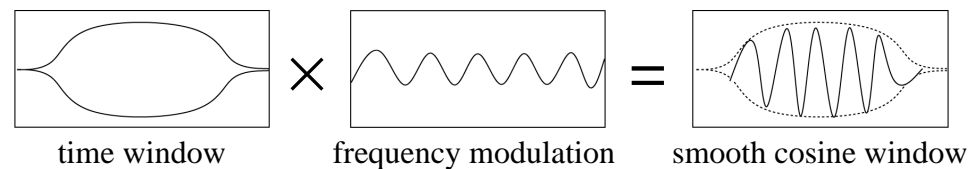
*Develop an automatic method for periodic and near-periodic motion cyclification*

- Our choice: warping on time x frequency domain
  - discrete transform: lapped cosine (LCT).
  - frequency contents are not deformed  $\Rightarrow$  “texture” of the movement is preserved.
  - cycles are detected by using an autocorrelation method.



# Time x Frequency Decomposition of 1D Signals

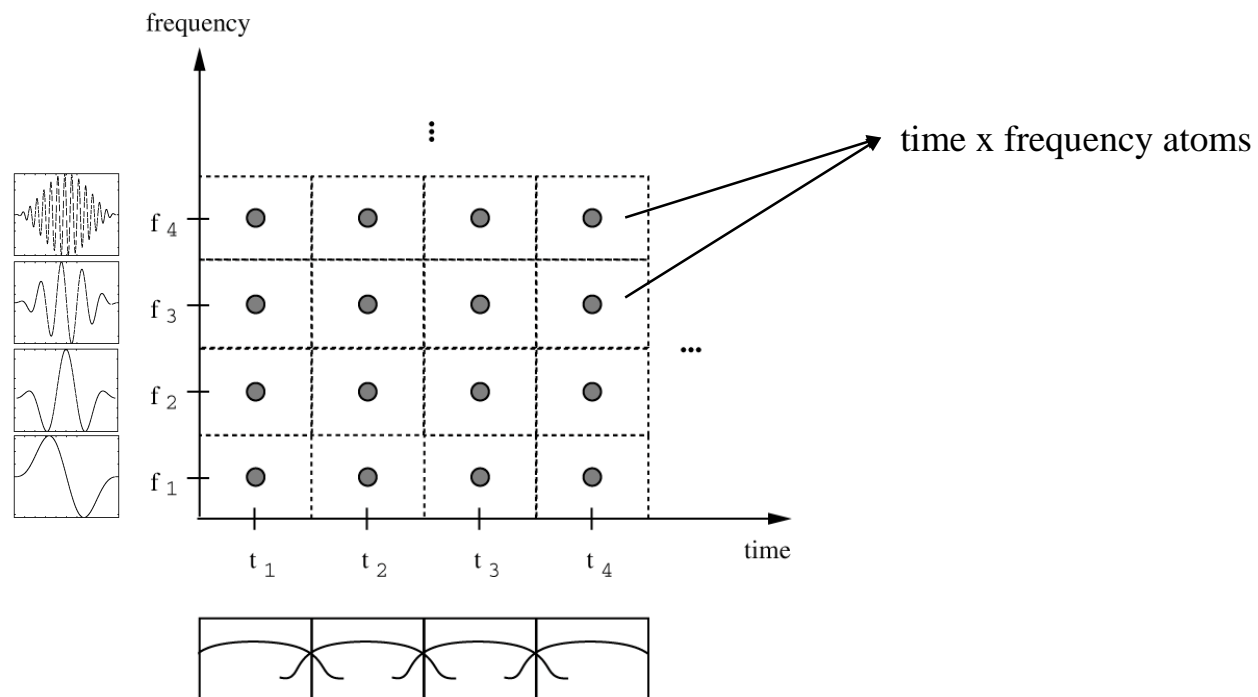
- Temporal decomposition into frequency packets
  - cosine transform.



- Lapped cosine transform (LCT)
  - orthonormal basis.
  - window overlapping  $\Rightarrow$  reduces boundary discontinuity.

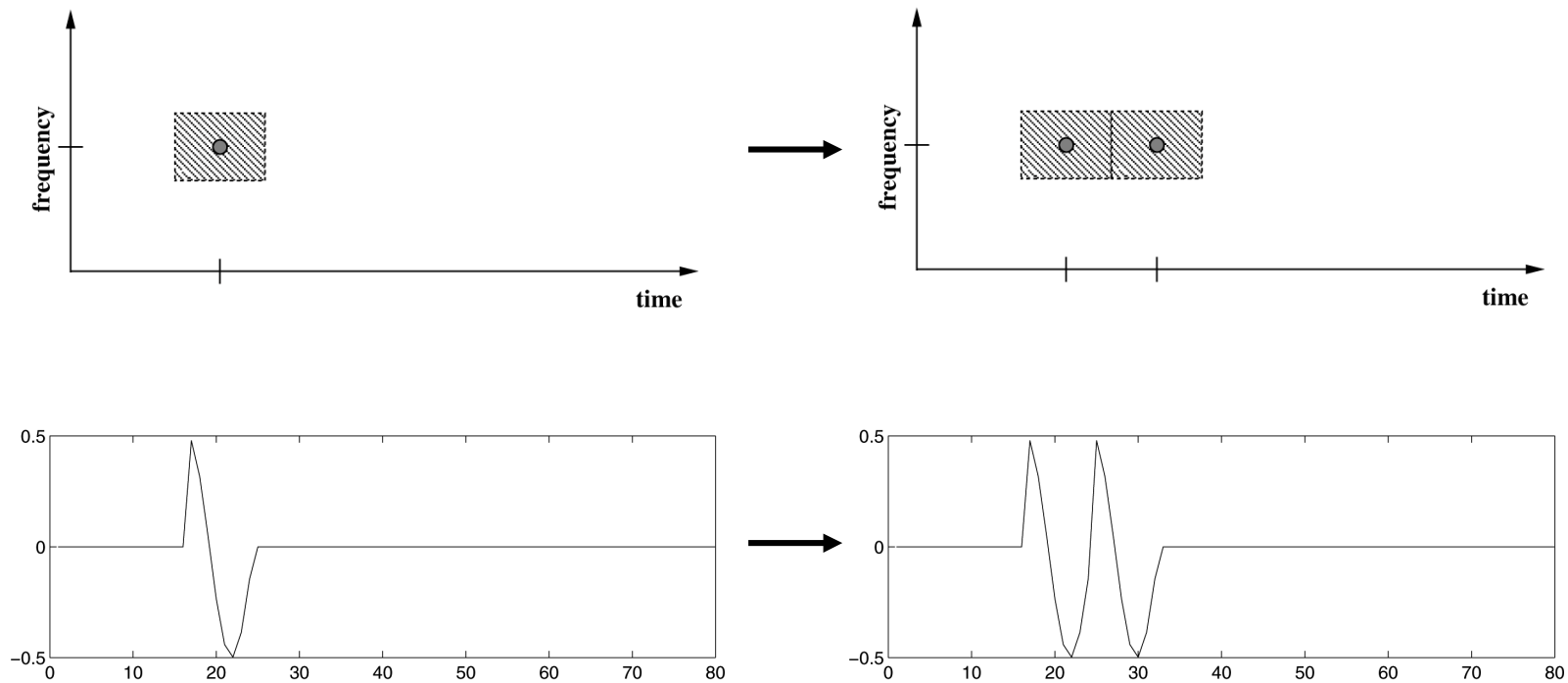
# Time x Frequency Representation of 1D Signals

- Finite partition of the time x frequency plane
  - vertical axis: frequency elements of the LCT basis.
  - horizontal axis: overlapped time windows.

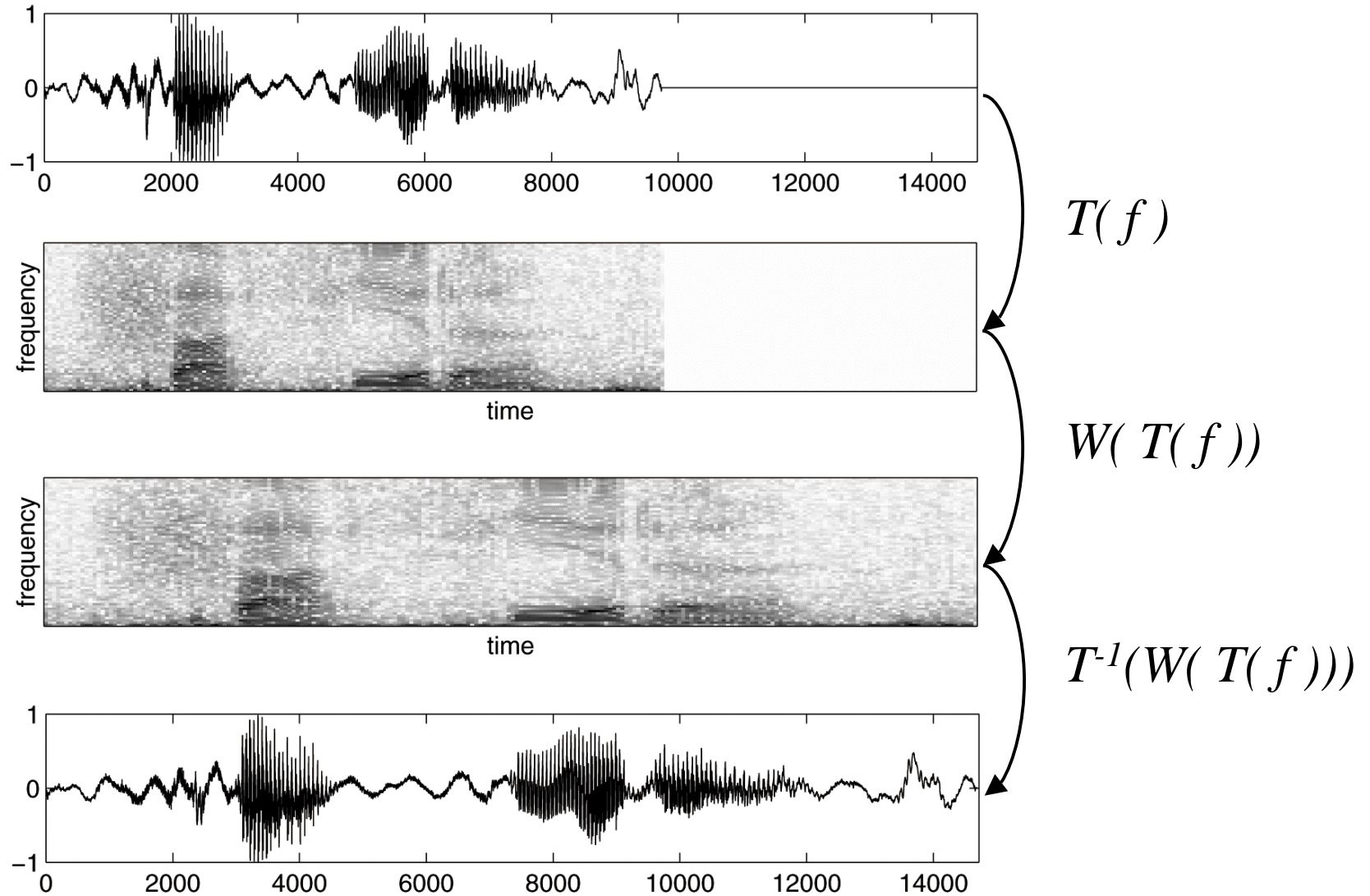


# Time x Frequency Dilation of 1D Signals

- Affine dilation on the time axis
  - replication of atom elements of the time x frequency representation.

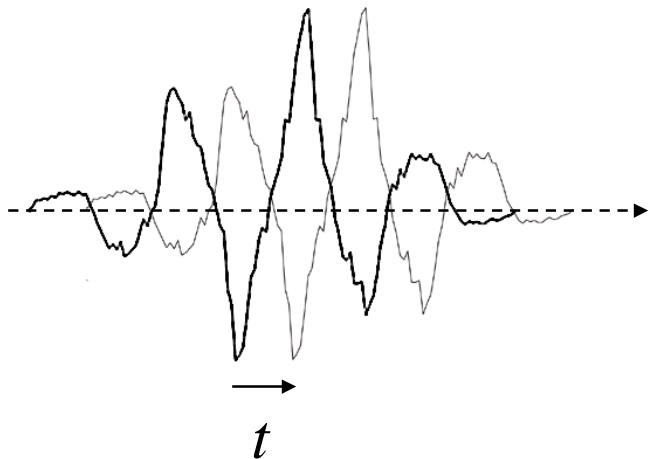


# Time x Frequency Warping of 1D Signals

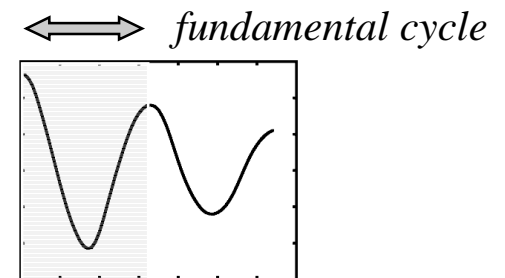


# Automatic Cycle Detection

- Fundamental cycle (FC)
  - circular autocorrelation method: measures the similarity between translated versions of a signal.
  - FC is given by the distance between consecutive maximum points.
  - lowest frequency in the signal.



$$\int f(u) \cdot f(u-t)$$



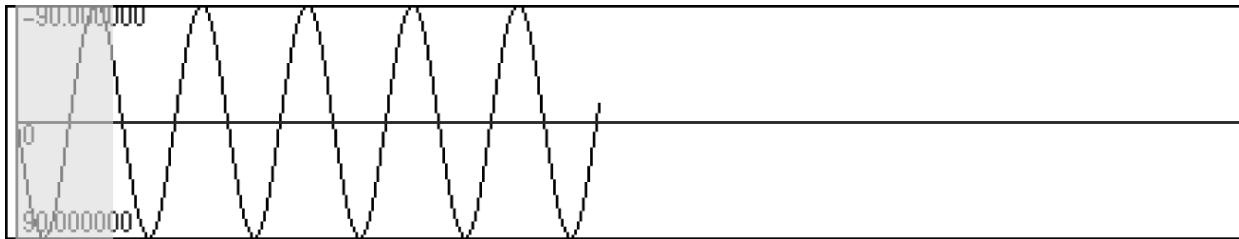
# Experiments (1 DOF)

- Re-timing with warp factor = 2.0
- Tests with sinusoidal functions
  - *sine* with fixed period.
  - *sine* with variable period and window size.
- Kinematic simulation of a pendulum
- Left upper arm joint motion curve

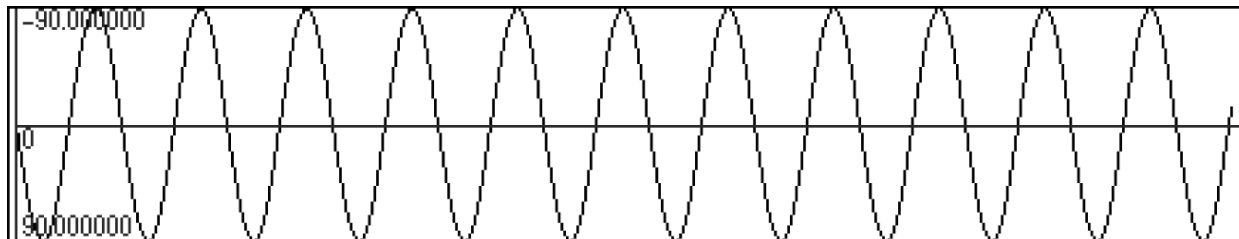
# Experiment #1

- *sine* function with fixed period.

↔ *FC detected by the algorithm*



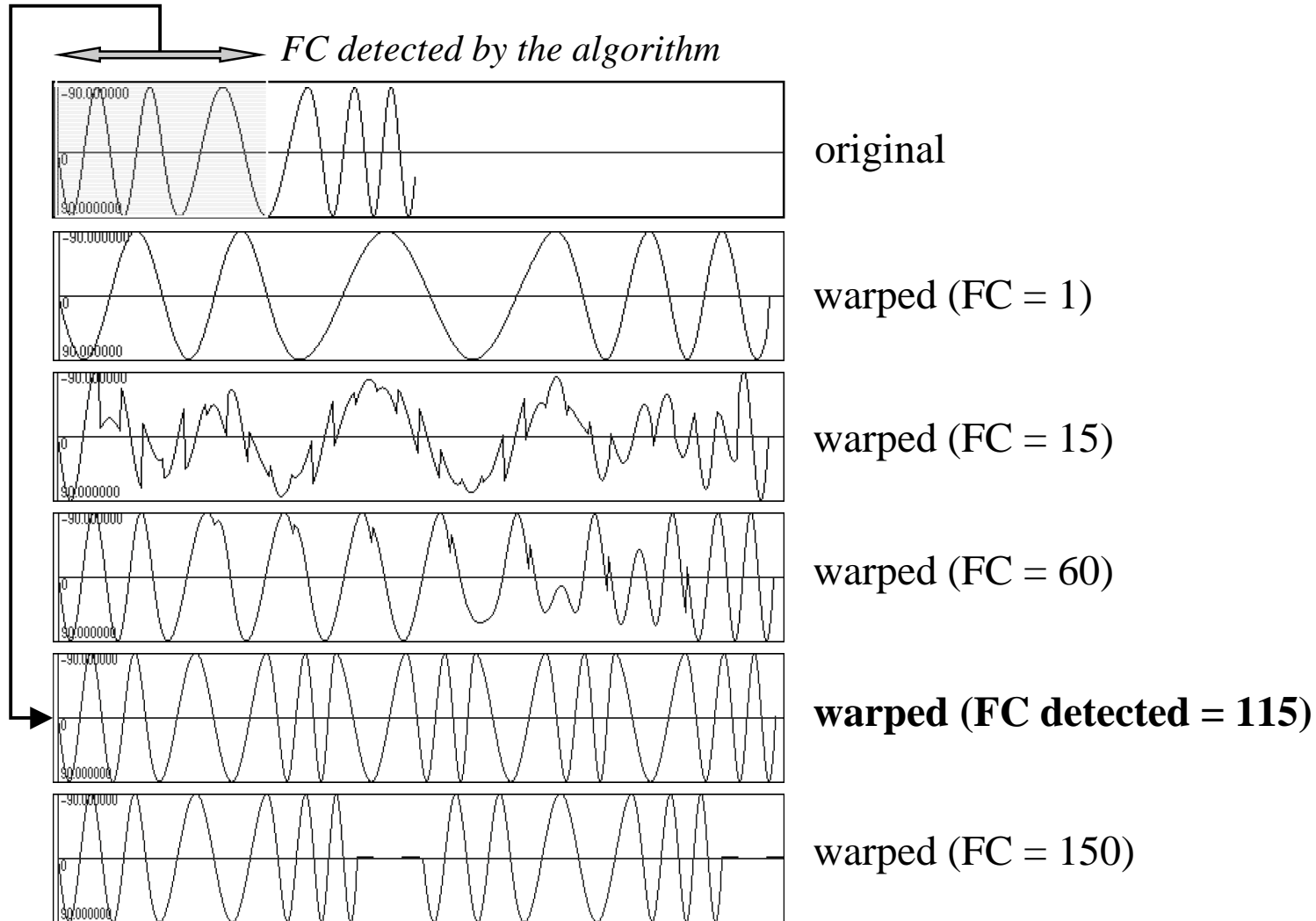
original



warped

# Experiment #2

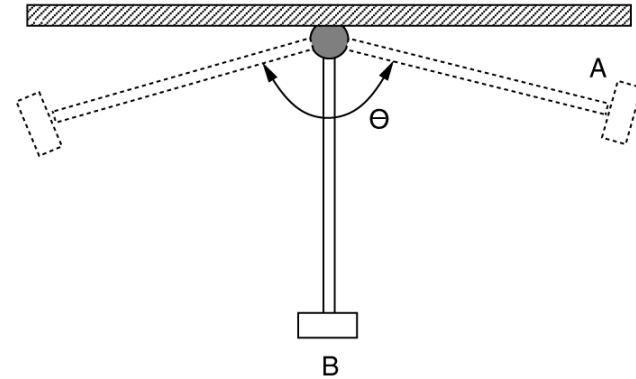
- *sine* function with variable period and FC.



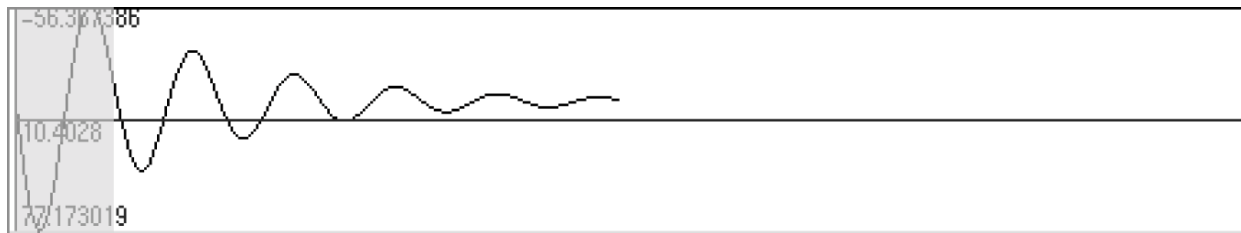


# Experiment #3

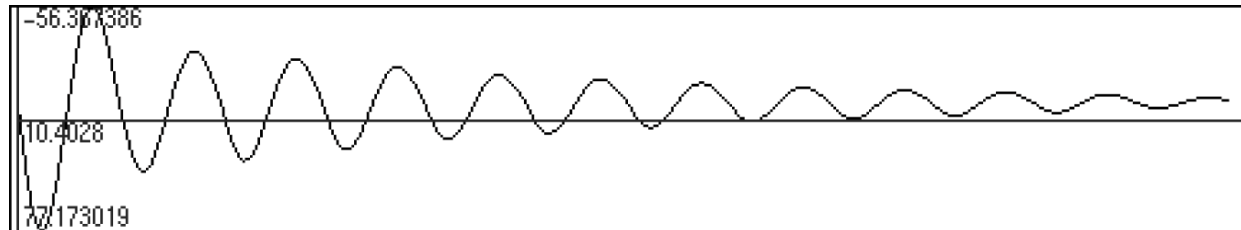
- kinematic simulation of a pendulum.



↔ *FC detected by the algorithm*



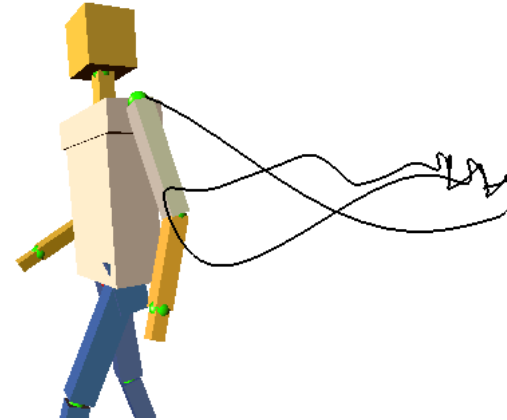
original



warped

# Experiment #4

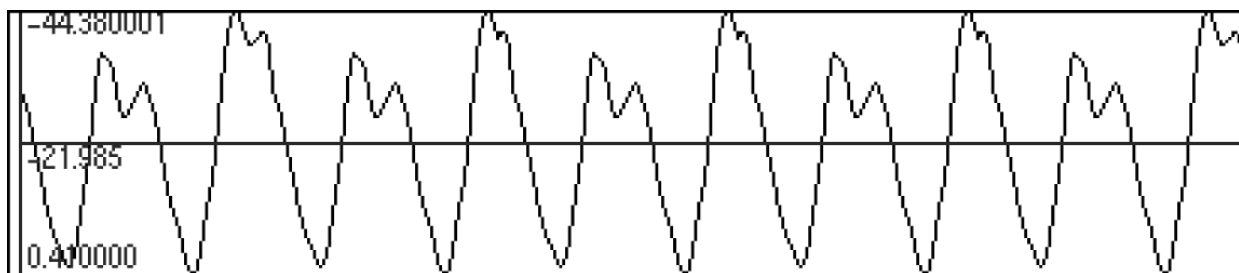
- left upper arm joint motion curve.



↔ *FC detected by the algorithm*



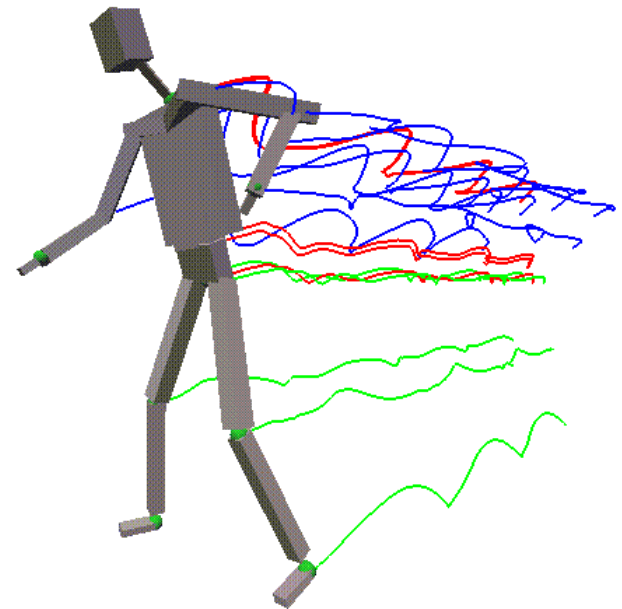
original



warped

# Cyclification of Articulated Figure Motion

- Articulated figure: complex structure
  - multiple joints and DOFs.
  - large amount of data to process and control.
  - *near-periodic* motions: synchronism between joints must be preserved by the warping algorithm.



# Strong and Weak Phase Dependence

- Strong

- direct structural relationship between joints (e.g. motion of knee and foot is influenced by upper leg joint motion).
- common periodic behavior  $\Rightarrow$  phases are multiples of a predominant FC.

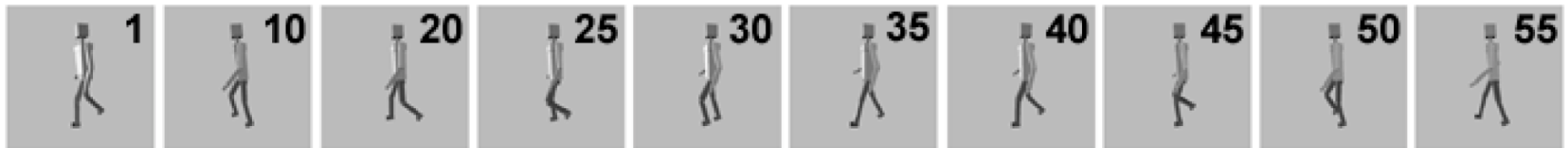
- Weak

- indirect structural relationship between joints (e.g. motion of arms and legs).
- happens due to balance and stability control.

# Strong and Weak Phase Dependence

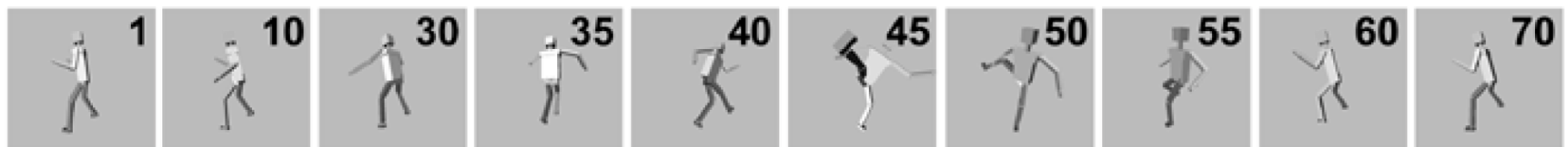
## ● Walk sequence

- strong dependence between outer and inner joints in arms and legs.
- weak dependence between arms and legs (cross synchronization).



## ● Backflip kick sequence

- strong dependence between outer and inner joints in arms and legs.
- weak dependence between arms and legs (coupled synchronization).



# Detection of Predominant Cycle

- For each group of joints
  - apply autocorrelation method to all motion curves, generating a set of FCs.
  - take the greater FC.
  - warp all motion curves within joint group using as input the selected FC.

# Conclusions

- New technique for cyclification of motion curves
  - time x frequency warping algorithm.
  - preserves the *shape* and *texture* of the curves.
  - works well with periodic and *near-periodic* curves.
- Cyclification of articulated figure motion
  - analysis of strong and weak dependencies between body segments.
- Video with results

# Future Work

- Algorithm extension and improvement
  - complex human figure motion.
- Synchronization of facial animation and audio
  - non-linear audio editing.
  - film dubbing (lip-sync).
- Integration of method on a full animation system
  - transform simultaneously human motion, facial animation and sound.



# **Additional Info**

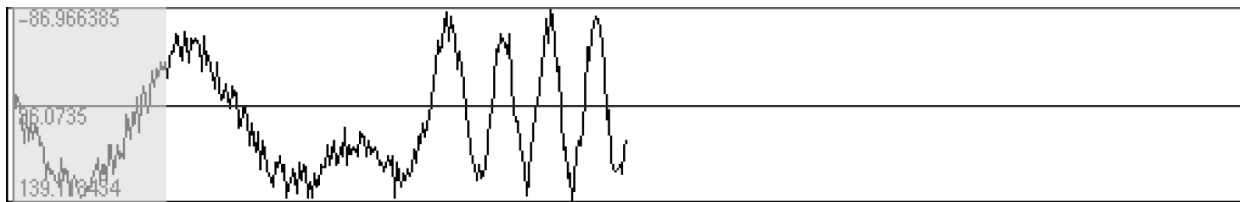
<http://www.visgraf.impa.br/mocap>



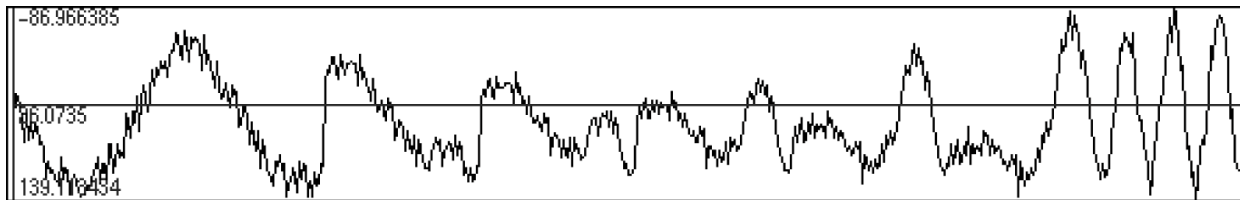
# Experiment #3

- *sine* function with variable period and noise.

↔ *FC detected by the algorithm*



original



warped