### POLITECNICO DI TORINO Repository ISTITUZIONALE

A novel approach to the analysis of muscle synergies based on the average threshold crossing technique

Original

A novel approach to the analysis of muscle synergies based on the average threshold crossing technique / Sapienza, Stefano; Vergara-Diaz, Gloria; Fabara, Eric; Clansey, Adam; Pugliese, Benito Lorenzo; Rossi, Fabio; Demarchi, Danilo; Bonato, Paolo. - ELETTRONICO. - (2021). (Intervento presentato al convegno 10th International IEEE EMBS Conference on Neural Engineering tenutosi a Virtual (USA) nel 4-6 May, 2021).

Availability: This version is available at: 11583/2950272 since: 2022-01-16T17:06:52Z

*Publisher:* IEEE Engineering in Medicine and Biology Society

Published DOI:

Terms of use:

This article is made available under terms and conditions as specified in the corresponding bibliographic description in the repository

Publisher copyright

(Article begins on next page)





## Purposes

This work aims to investigate the application of the Average Threshold Crossing (ATC) technique in the analysis of muscle synergies.

First the ability of the technique to approximate different modulations of the electromyographic (EMG) data was assessed via simulations.

Then muscle synergies from ATC envelopes were extracted from on real EMG data collected during over ground walking and compared to the ones obtained from the standard envelopes.

## **ATC Technique**

The ATC technique evaluates the muscle activity integrating on a time window of fixed length the number of times the EMG signal exceeds a threshold.



Figure 1. ATC Extraction. The blue line represents the EMG signal, the red horizontal line the threshold level abd the **black** dashed vertical line the beginining and the end of the ATC Windows.

### Contacts

Motion Analysis Laboratory Dept. of Physical Medicine and Rehabilitation - Harvard Medical School

Spaulding Rehabilitation Hospital 300 First Avenue, Charlestown, MA 02129 Stefano Sapienza PhD ssapienza@partners.org

# A NOVEL APPROACH TO THE ANALYSIS OF MUSCLE SYNERGIES BASED ON THE AVERAGE **THRESHOLD CROSSING TECHNIQUE**

## S. Sapienza<sup>1</sup>, G. Vergara-Diaz<sup>1</sup>, E. Fabara<sup>1</sup>, A. Clansey<sup>1</sup>, B. L. Pugliese<sup>1</sup>, F. Rossi<sup>2</sup>, D. Demarchi<sup>2</sup> and Bonato P<sup>1</sup>.

<sup>1</sup> Dept. of PM&R, Harvard Medical School, Spaulding Rehabilitation Hospital, Boston MA, USA. <sup>2</sup> Dept. of Electronics and Telecommunications, Politecnico di Torino, Turin, Italy.



**Figure 2. Simulation Flow Chart** 

# Simulation

Five hundred different modulations were generated by synthesizing EMG data, produced by multiplying colored noise by a Gaussian waveform, and adding white noise to obtain a SNR of 10 dB. For each of these modulations, the EMG envelope was extracted by applying a cascade of a high pass filter, a rectifying stage, and a low pass filter. The ATC envelope was computed using three different window lengths (10, 20 and 50 ms) and three different threshold values (2.5, 3 and 3.5 the RMS noise level). The ATC envelope was then resampled to have the same number of points as the initial signal, and lowpass filtered to smooth the discontinuities. Finally, the R2 between the ATC envelope and the portion of the EMG envelope above the threshold level used to estimate the ATC was computed. Due to the stochastic nature of the simulated timeseries, <u>multiple repetitions with the same</u> parameters, provided slightly different outputs. For this reason, each one of the modulations was generated 100 times and the effect of averaging a different number of epochs on the ATC envelope was evaluated. The results of the simulation are shown in Table I

		ATC Threshold Value		
ATC Window Length	Epochs Averaged	2.5 x RMS Noise	3 x RMS Noise	3.5 x RMS Noise
10 ms	1	0.51 (0.35)	0.74 (0.21)	0.81 (0.16)
20 ms	5	0.71 (0.13)	0.87 (0.10)	0.94 (0.04)
50 ms	10	0.75 (0.09)	0.90 (0.06)	0.96 (0.02)
10 ms	1	0.51 (0.34)	0.74 (0.20)	0.82 (0.14)
20 ms	5	0.70 (0.12)	0.87 (0.08)	0.94 (0.04)
50 ms	10	0.74 (0.08)	0.90 (0.05)	0.96 (0.02)
10 ms	1	0.46 (0.36)	0.72 (0.22)	0.81 (0.17)
20 ms	5	0.67 (0.14)	0.85 (0.09)	0.94 (0.04)
50 ms	10	0.71 (0.09)	0.88 (0.06)	0.96 (0.03)
Table I D2 values obtained from the simulation (mean (atd))				

**Table I.**  $K_{2}$  values obtained from the simulation (mean (Std))

### **Test on EMG Data** The EMG data collected during over ground walking of 8 healthy subjects were analyzed using a 20 ms ATC window, with threshold value equal to 3 times the noise RMS value. The data was averaged over 5 gait cycles. This set of parameters to estimate the ATC envelope appeared to provide a good trade-off between the quality of the reconstruction and the need to use a low threshold value to fully capture the amplitude modulation of the EMG data. The average cosine similarity between the weights of the muscle synergies derived from ATC and the ones extracted using the traditional envelopes was 0.92 (±0.05), while the average value of ZLCC for the temporal coefficients was 0.93 (±0.06). Below an example of synergies extracted from ATC envelopes (window length 20 ms, 5 steps average). and standard EMG envelopes. GA SO TA PE VL VM BF ST GA SO TA PE VL VM BF ST Muscle List: Gastrocnemius 2. Soleus 3. Tibialis Anterior GA SO TA PE VL VM BF ST GA SO TA PE VL VM BF ST 4. Peroneus 5. Vastus Lateralis 6. Vastus Medialis Biceps Femoris 8. Semitendinosus GA SO TA PE VL VM BF ST Figure 3. Synergy Comparison. In blue the decomposition from the classic EMG envelopes and in red the results obtained using the ATC. Conclusion 1. Selecting the proper threshold and window length, it is possible to obtain R<sup>2</sup> similarity ATC envelopes over multiple epochs.

temporal activations.





values above 0.8 between ATC and EMG envelopes. This result improves by averaging the

2. The synergies extracted using the ATC technique showed high similarity with the ones obtained with a standard approach using the EMG envelopes for both weights and