



Conference: Interdisciplinary Congress of Renewable Energies, Industrial Maintenance, Mechatronics
and Information Technology
BOOKLET



RENIECYT - LATINDEX - Research Gate - DULCINEA - CLASE - Sudoc - HISPANA - SHERPA UNIVERSIA - E-Revistas - Google Scholar
DOI - REDIB - Mendeley - DIALNET - ROAD - ORCID

Title: Metodología para la determinación de patrones en señales electroencefalográficas.

Authors: ESQUEDA-ELIZONDO, José Jaime, TRUJILLO-TOLEDO, Diego Armando, PINTO-RAMOS, Marco Antonio y REYES-MARTÍNEZ, Roberto Alejandro.

Editorial label ECORFAN: 607-8695
BCIERMMI Control Number: 2019-129
BCIERMMI Classification (2019): 241019-129

Pages: 12
RNA: 03-2010-032610115700-14

ECORFAN-México, S.C.
143 – 50 Itzopan Street
La Florida, Ecatepec Municipality
Mexico State, 55120 Zipcode
Phone: +52 1 55 6159 2296
Skype: ecorfan-mexico.s.c.
E-mail: contacto@ecorfan.org
Facebook: ECORFAN-México S. C.
Twitter: @EcorfanC

www.ecorfan.org

Holdings		
Mexico	Colombia	Guatemala
Bolivia	Cameroon	Democratic
Spain	El Salvador	Republic
Ecuador	Taiwan	of Congo
Peru	Paraguay	Nicaragua

Introduction

Methodology

Entropy

Coherence

Feature Extraction

Selecting Possible Patterns

Experiments in User A

Experiment in User B

Conclusions

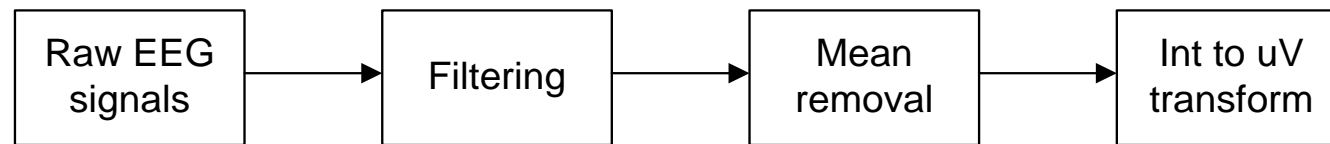
Acknowledgements

Introduction

- The measurement of the electrical activity of the brain is called electroencephalogram (EEG) and is taken by electrodes placed on the scalp of the subject.
- These electrodes measure the electrical activity of the brain cortex and are placed using a standardized scheme.
- With digital signal processing algorithms is possible to extract features that can describe some thinking patterns and that can be used to control some devices.
- The quality of the patterns is defined by the feature extractions techniques used. There are many kinds of techniques that are widely used nowadays.
- Feature extraction allows extracting more useful or descriptive information hidden in a signal by reducing unnecessary or redundant information.
- Using digital signal processing algorithms is possible to reduce noise, interference, and artifacts before the feature extraction process begins. Once the feature extraction is done, the classification process can be done.

Methodology

- The EEG signals are taken with the Epoc+ via the Emotiv Pro software, which is supplied by the Emotiv company.
- Three EEG one-minute signal register of two people between 22 to 24 years (A and B), thinking first in neutral or relax, then in right and finally in left was taken.
- The signals were recorded seated with their eyes open, one register at the time.
- First, the signal is filtered with a built in 5th order sync digital filter and also with notch filters at 50 Hz and 60 Hz.
- Next, we remove the mean for each channel in order to eliminate de isoelectric line for all the channels.
- Finally, the value obtained is multiplied by $0.51\mu\text{V}$ (ADC resolution), in order to convert the signal to volts.



Signal Preprocessing

Entropy

- Entropy is a computational complexity sensitive tool that assesses the signal dynamics in a time series data.
- Neural systems are neither completely a random process nor a completely regular one, the measurements of the complexity should have low values for a completely random or a completely regular system.
- Entropy can be used as a simple non-linear feature extraction technique. In this paper Shannon, Log Energy and Normalized Entropies are used.

Coherence

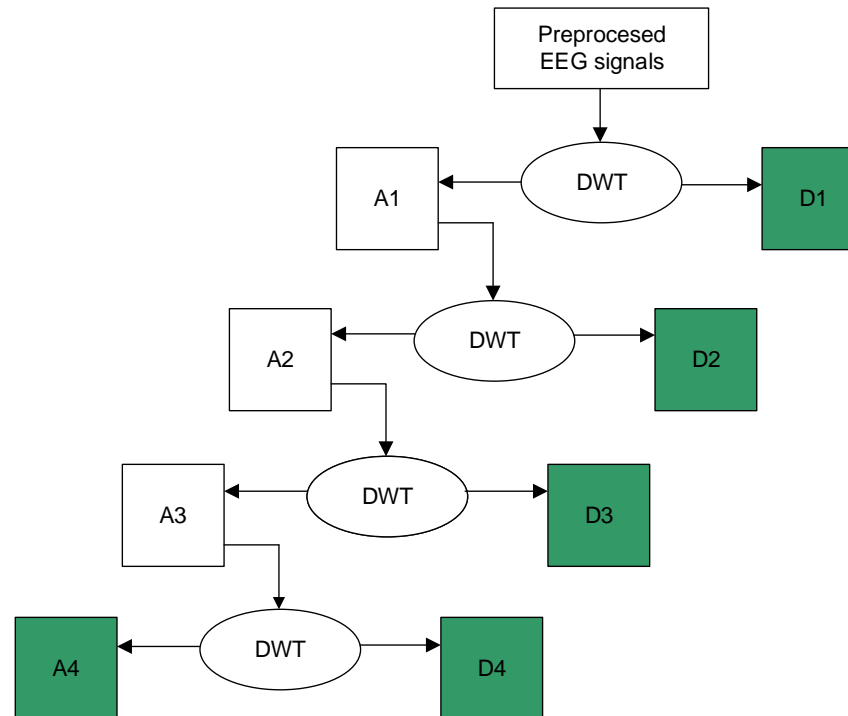
- Coherence is a frequency function, presented in normalized units, that indicates how much the power spectral density of one signal $x(t)$, corresponds to the other one $y(t)$.
- Coherence is a quadratic correlation coefficient that estimates the consistency of the amplitude and phase related between two signals in a frequency band.
- When the coherence value is 1, this means that the signal $x(t)$ totally corresponds to signal $y(t)$, and they are the same signal.

$$\Gamma^2(f) = \frac{|S_{xy}(f)|^2}{S_{xx}(f)S_{yy}(f)}; \quad 0 \leq \Gamma(f) \leq 1.$$

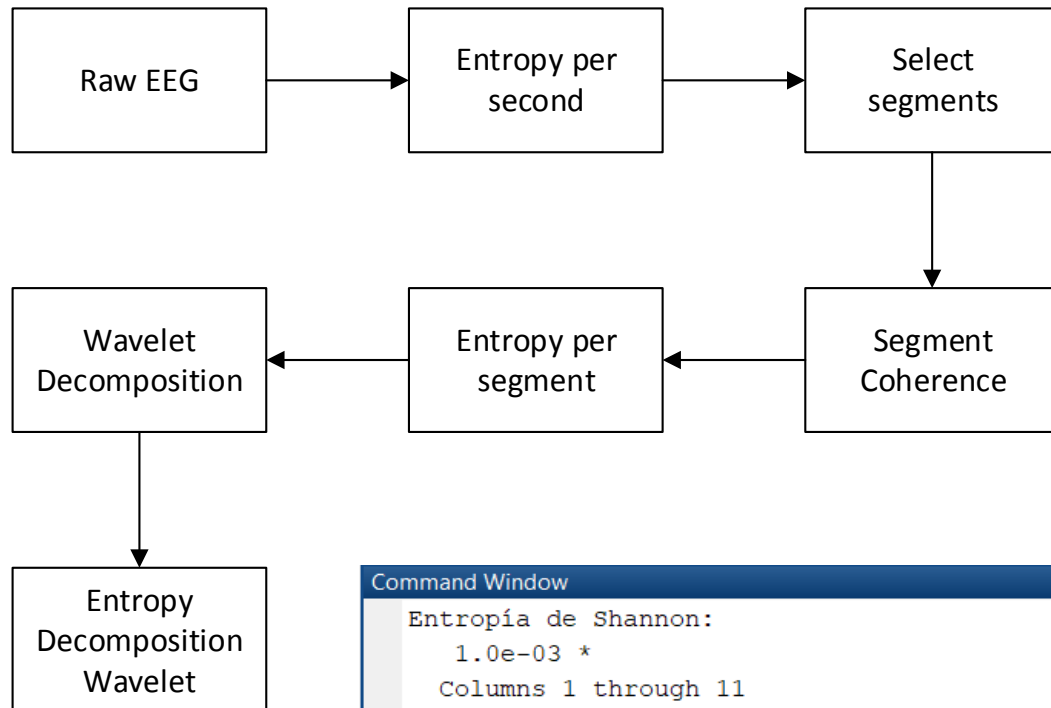
- Any pair of signals can be coherent in some frequency bands and not in another one. In contrast with the amplitude measurements, coherence measures the synchronization between two signals based principally on the phase consistency.
- This represents that if two signals have different phase (as in the common linear simple circuits).
- A high coherence value (near to 1) is presented when the phase difference tends to stay constant.
- For each frequency, the coherence measures when the signals are related one to each other with a linear and time-invariant transformation

Feature Extraction

- First, a visual inspection is made for identifying some possible patterns.
- Then, some segments of the signal containing those possible patterns are taken and then the Entropy and Coherence functions are obtained in order to verify that they have similar levels.
- Then, a four-level Discrete Wavelet Decomposition is done in order to obtain the detailed coefficients (D_x) and the approximated coefficients (A_x).
- Next, the Entropy of the coefficients D_x and A_x are obtained.



Selecting possible patterns



The Shannon, Log Energy and Normalized Entropies of the pair of analyzed segments are obtained in order to verify their relationship.

Subject A, 22 years; Subject B, 24 years.

Command Window

```
Entropía de Shannon:  
1.0e-03 *  
Columns 1 through 11  
0.0059 0.0052 0.0125 0.0178 0.1354 0.2196 0.0495 0.0082 0.0005 0.0014 0.0033  
Columns 12 through 22  
0.0041 0.0034 0.0062 0.0064 0.0068 0.0109 0.0148 0.0109 0.0063 0.0035 0.0032  
Columns 23 through 33  
0.0053 0.0041 0.0313 0.0250 0.0024 0.0026 0.0024 0.0027 0.0126 0.0269 0.0169  
Columns 34 through 44  
0.0195 0.0197 0.0115 0.0077 0.0077 0.0074 0.0066 0.0049 0.0083 0.0058 0.0074  
Columns 45 through 55  
0.0252 0.0264 0.0196 0.0139 0.0109 0.0070 0.0072 0.0091 0.0092 0.0071 0.0086  
Columns 56 through 60  
0.0071 0.0067 0.0051 0.0052 0.0054  
Entropía Log Energy:  
1.0e+03 *
```

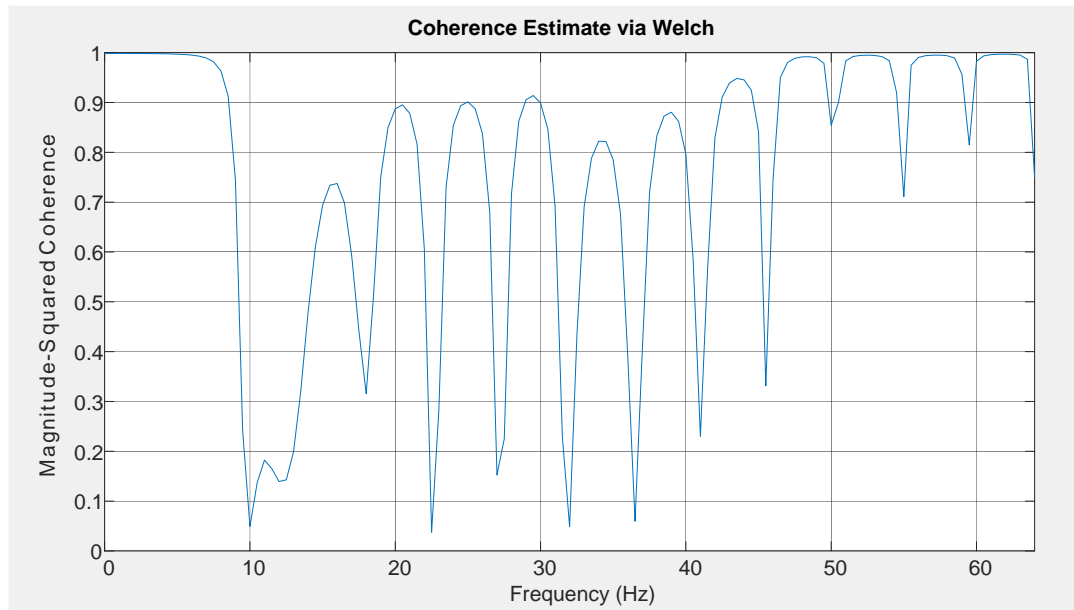
Columns	1	2	3	4	5	6	7	8	9	10	11
1-11	0.0059	0.0052	0.0125	0.0178	0.1354	0.2196	0.0495	0.0082	0.0005	0.0014	0.0033
12-22	0.0041	0.0034	0.0062	0.0064	0.0068	0.0109	0.0148	0.0109	0.0063	0.0035	0.0032
23-33	0.0053	0.0041	0.0313	0.0250	0.0024	0.0026	0.0024	0.0027	0.0126	0.0269	0.0169
34-44	0.0195	0.0197	0.0115	0.0077	0.0077	0.0074	0.0066	0.0049	0.0083	0.0058	0.0074
45-55	0.0252	0.0264	0.0196	0.0139	0.0109	0.0070	0.0072	0.0091	0.0092	0.0071	0.0086
56-60	0.0071	0.0067	0.0051	0.0052	0.0054						

Experiments in user A (Entropies)

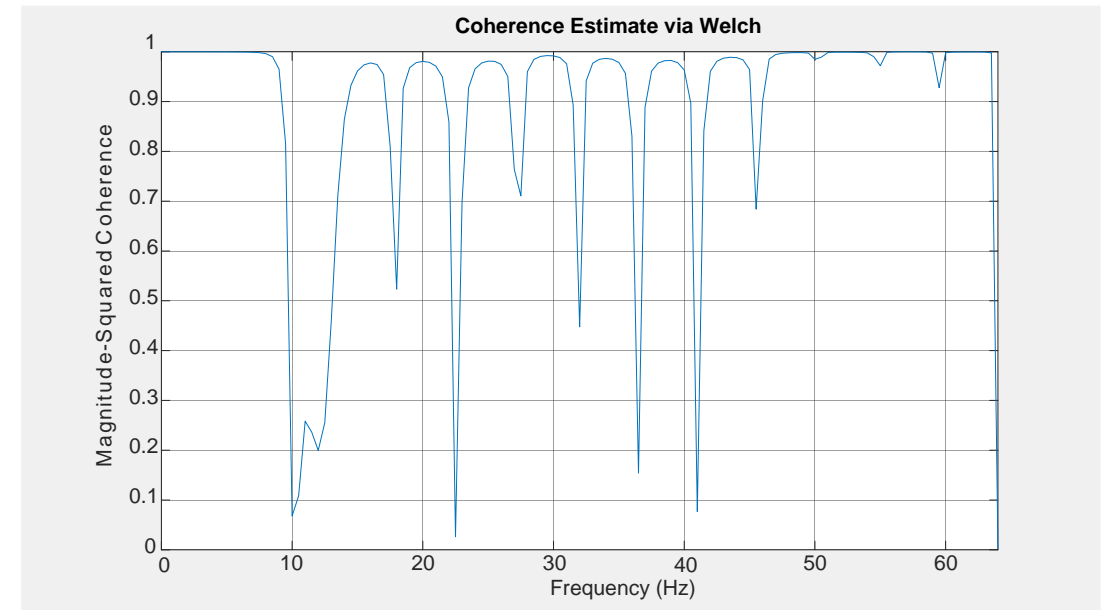
Channel Time	Entropy (Shannon)	Entropy (Log Energy)	Entropy (Norm)
AF3 8s & 33s	6.0682e-05 5.9660e-05	-2.2483e+03 -2.2509e+03	0.0089 0.0088
O1 14s & 15s	0.0062e-4 0.0064e-4	-2.5391 -2.5344	0.0023 0.0024

Channel	Entropy (Shannon)	Entropy (Log Energy)	Entropy (Norm)
F4 8s & 23s	0.2732e-03 0.2717e-03	-2.0248e+03 -2.0255e+03	0.00213 0.0213
T8 18s & 21s	5.7666e-05 5.1997e-05	-2.2552e+03 -2.2694e+03	0.0086 0.0081

We can notice that are kind of similar values are obtained.



AF3, left test

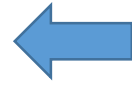


F4, right test

Experiments in user A (Wavelet Entropy)

Electrode	D3 (Entropy)		
	Shannon	Log Energy	Norm
AF3			
8 sec.	5.8756e-09	-430.9594	1.2347e-05
33 sec.	1.3581e-08	-398.1880	2.4502e-05

Shannon entropies are different, but Log Energy and Normalized entropies for the Detail coefficients are closer.



Shannon and Normalized entropies are quite different, but the Log Energy ones are similar.



Electrode	D4 (Entropy)		
	Shannon	Log Energy	Norm
AF3			
8 sec.	2.6990e-09	-204.8071	7.3692e-06
33 sec.	8.9709e-09	-198.3364	1.4654e-05

Electrode	A4 (Entropy)		
	Shannon	Log Energy	Norm
AF3			
8 sec.	5.6674e-05	-131.9524	0.0028
33 sec.	5.6309e-05	-132.0304	0.0028

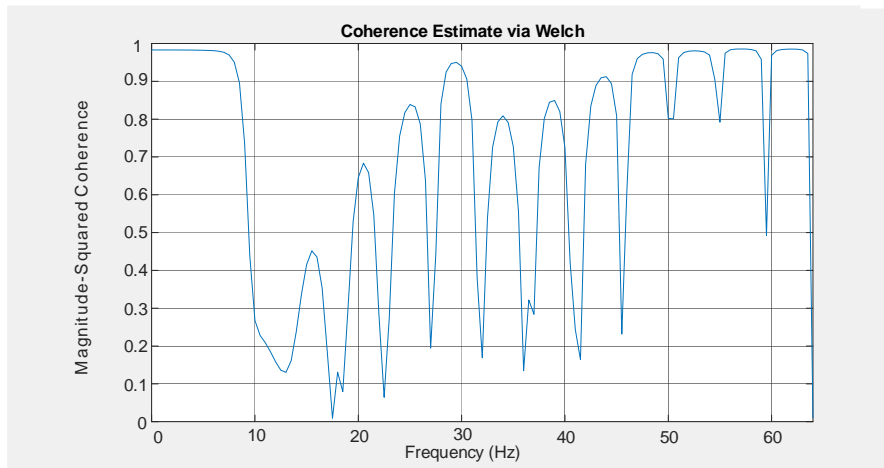
The entropies are similar and these entropies are different from the ones obtained using only the one-second data segments.



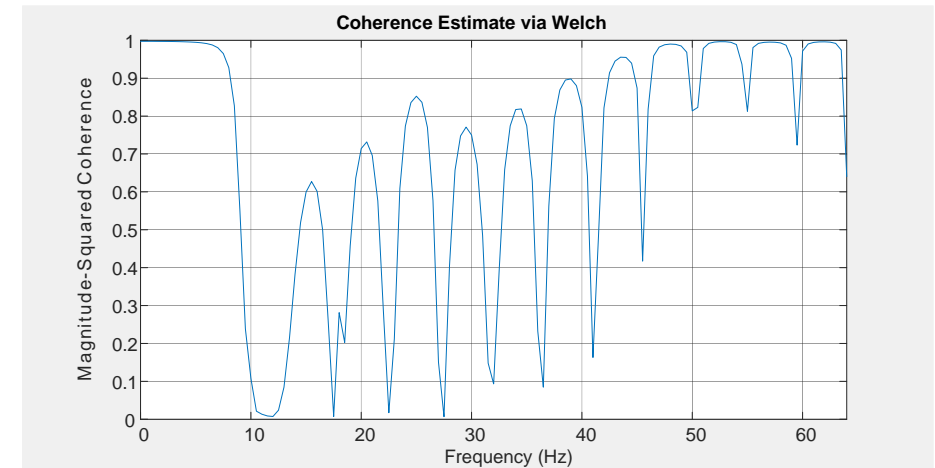
Experiments in user B (Entropies)

Channel Time	Entropy (Shannon)	Entropy (Log Energy)	Entropy (Norm)
P7			
23 s	4.7741e-05	-2.2812e+03	0.0077
52 s	9.8571e-05	-2.1871e+03	0.0117

Electrode Time	Entropy (Shannon)	Entropy (Log Energy)	Entropy (Norm)
T8	5.2676e-05	-2.2680e+03	0.0082
55s & 56s	5.4524e-05	-2.2633e+03	0.0083
F3	2.7070e-05	-2.3600e+03	0.0055
7s & 36s	2.7018e-05	-2.3600e+03	0.0055



P7, Subject B, right test



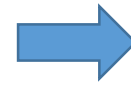
T8, Subject B, left test

Experiments in user B (Wavelet Entropy)

Closer entropy values were obtained for the Log Energy and the Normalized entropies.

Electrode	D4 (Entropy)		
	Shannon	Log Energy	Norm
P7			
23 sec.	8.7090e-09	-200.0164	1.2708e-05
52 sec.	5.0026e-08	-186.9553	3.8515e-05

It can be observed that Log Energy and Normalized Entropies got closer values.



Electrode	D3 (Entropy)		
	Shannon	Log Energy	Norm
P7			
23 sec.	1.4247e-08	-405.1969	2.3961e-05
52 sec.	2.2473e-08	-386.3170	3.4070e-05

These entropies values are discrepant. The closer ones are Log Energy, but there are not too similar.



Electrode	A4 (Entropy)		
	Shannon	Log Energy	Norm
P7			
23 sec.	4.4841e-05	-134.2122	0.0025
52 sec.	9.5113e-05	-127.3002	0.0038

Conclusions

- We observe that the methodology presented is useful to determine the confidence of the possible pattern.
- Sometimes, using the entropies and coherence functions directly to the preprocessed signal does not reflect the real significance of the possible pattern.
- Working with the entropies of the coefficients of the Discrete Wavelet Transform is useful to validate the possible pattern.
- In this case, the Log Energy and the Normalized entropies gave closer values, so they had better performance.



ECORFAN®

© ECORFAN-Mexico, S.C.

No part of this document covered by the Federal Copyright Law may be reproduced, transmitted or used in any form or medium, whether graphic, electronic or mechanical, including but not limited to the following: Citations in articles and comments Bibliographical, compilation of radio or electronic journalistic data. For the effects of articles 13, 162,163 fraction I, 164 fraction I, 168, 169,209 fraction III and other relative of the Federal Law of Copyright. Violations: Be forced to prosecute under Mexican copyright law. The use of general descriptive names, registered names, trademarks, in this publication do not imply, uniformly in the absence of a specific statement, that such names are exempt from the relevant protector in laws and regulations of Mexico and therefore free for General use of the international scientific community. BCIERMMI is part of the media of ECORFAN-Mexico, S.C., E: 94-443.F: 008- (www.ecorfan.org/ booklets)