

## Detection of the Cognitive Components of Brain Potentials Using Wavelet Coefficients

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*Received 28 November 2003; received in revised form 26 July 2004; accepted 25 October 2004*

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### Abstract

P300 is the most predominant cognitive component of the brain signals. In this study, the single trial event related potentials recorded from the scalp, were decomposed to their time-frequency components using discrete wavelet transform. These quantities were later analyzed as the features related to the cognitive activities of brain. Study on these features showed that cognitive processes of the brain often reflected in the feature of  $\delta$  and  $\theta$  bands. The aim of this study, as a primary step for "lie detection using brain signals (EEG - Polygraphy)", was to design a system for discriminating between single trials involved P300 and those without it. In the first approach, an optimal discriminant function based on 9 features was designed using "Stepwise Linear Discriminant Analysis". Detection accuracy was 75% in training data and 71% in test data. More study on this method showed that almost similar accuracy could be obtained from the features of Pz channel alone. In the second approach, the modular learning strategy - based on principal component analysis and neural networks - was used. After training the systems, the maximum classification accuracy was 76% in train data and 72% in test data.

**Keywords:** Brain potentials; Cognitive functions; P300, Lie detection; Discrete wavelet transform; Linear discriminant analysis; Modular learning strategy

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P300

P300

P300

Pz

P300

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P300

ERP

P300

ERP

ERP EEG

P300

P300

P300

[ ]

P300

P300 :

P300

Basar

EEG ERP

[ ]

P300

P300

P300

P300

P300

) P300

(

P300

P300

P300

P300

<sup>1</sup>Resolution  
<sup>4</sup>Malingering

<sup>2</sup>Demance  
<sup>5</sup>Target

<sup>3</sup>False Memory  
<sup>6</sup>Non-Target

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<sup>7</sup>(rCBF)

P300

<sup>10</sup>SPECT <sup>9</sup>PET <sup>8</sup>fMRI

<sup>11</sup>MEG EEG

SPECT PET fMRI

MEG

) EEG

(

EEG

ERP EEG

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<sup>7</sup> regional Cerebral Blood Flow  
<sup>10</sup> Single Photon Emission Computed Tomography

<sup>8</sup> functional Magnetic Resonance Imaging  
<sup>11</sup> Magnetoencephalography

<sup>9</sup> Positron Emission Tomography

ERP EEG

ERP <sup>12</sup>ERP P300

<sup>13</sup>(EP) ( ERP EEG)

EEG ERP

ERP EP

( )

ERP

(ABR ) ERP

ERP

(>100ms)

ERP (EEG)

( ) P ( ) N EEG

N1 N100

(

ERP

ERP EEG

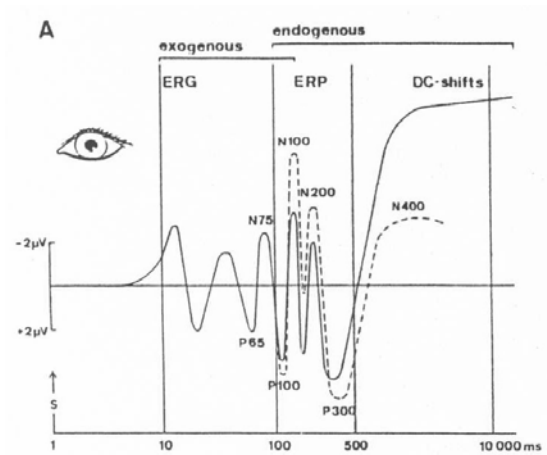
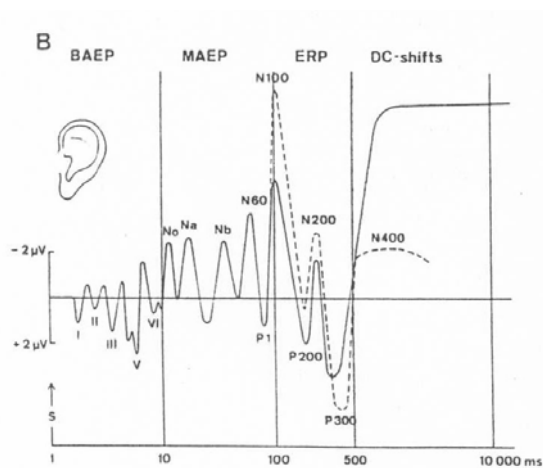
N400 P300 N200 P200 N100 P100

<sup>12</sup> Event Related Potential

<sup>13</sup> Evoked Potential

<sup>14</sup> Exogenous ERPs

<sup>15</sup> Endogenous ERPs



[ ] ) (B) (A)

100ms N75 P65 (ERG) :A

P300 N200 N100 P100

DC N400 ( )

22(MAEP) 21(BAEP) :B

P300

P300

[ ] P300

P300

[ ] P300

P300

[ ] ( ) P300

EEG ERP P300

P300 ERP

P300 ( )

<sup>16</sup> Orienting  
<sup>20</sup> Semantic Expectancy

<sup>17</sup> Selective Attention  
<sup>21</sup> Acoustic Brain-stem Evoked Potentials

<sup>18</sup> Stimulus Evaluation  
<sup>22</sup> Mid-Latency Components

<sup>19</sup> Context Updating  
<sup>23</sup> Task

P300

) Hippocampus

Medial-Temporal

(.

Hippocampal

P300

Tempral-Parietal Junction

. [ ]

P300

P300

" :

P300

" [ ]

**P300**

**Oddball**

P300 Sokolov

[ ]

P300

Oddball

N100

N200 P200

P300

[ ]

**P300**

P300

P300

300ms

300ms

Visual

1000ms

P300

1000

300

P300

P300

Fz Cz Pz

P300

(Pz)

(Pz>Cz>Fz)

(Fz)

Intelligence )

P300

(Personality

[ ]

P300

ERP

P300

P300

P300

[ ]

P300

P300

[ ]

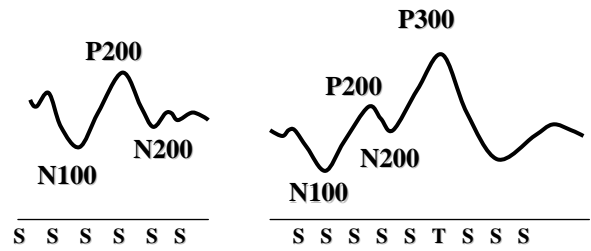
**P300**

P300

<sup>24</sup> Attentional Resource Allocation

<sup>25</sup> Updating

P300  
<sup>28</sup>(BCI)  
 Bayliss Polikoff  
 BCI P300



Polikoff [ ]

[ ] P300 Oddball

P300

Polikar

[ ]

P300

P300

P300

Oddball

Oddball

( )

MLP

P300

( )

<sup>27</sup>MS

Autism Alcoholism

( )

[ ]

Donchin Farwell Rosenfeld

[ ]

Iacono

P300 [ ]

Miller Rosenfeld

(P300 )

[ ]

P300

P300

<sup>26</sup> Alzheimer  
<sup>28</sup> Brain-Computer Interface

<sup>27</sup> Multiple Sclerosis  
<sup>29</sup> Totally Paralyzed



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EEG

EEG

EEG

EEG

EOG

NICOLET

Oddball

( )

MATLAB

Fz

Ag-AgCl

Pz Cz

ERP

(.

EOG

Jansen

EEG

P300

[ ]

P300

EEG

Pz Cz Fz

Ademoglu

B-Spline

B-Spline

(EEG)

Quadratic B-Spline

[ ]

[ ]

ERP

ERP

EEG

ERP

Demiralp

( )

P300

[ ]

[ ]

ERP

Pz Cz Fz

ERP

[ ]

C Pz P)

(Fz F Cz

/

( A T D)

)

.(

( ) ( ) :

( ) ( )

( )

<sup>31</sup> Functional Components  
<sup>33</sup> Semiorthogonality

<sup>32</sup> Near-Optimal Time-Frequency Localization  
<sup>34</sup> Compact Support

$D(x) = 0$

B A  
 D )  
 SPSS (

n  
 B A

n  
 " " Independent - Sample T-Test

n m

(m < n) m

m

SPSS ( )

n  $[f_1(x), f_2(x), \dots, f_n(x)]$   
 A x  
 B A B

(Pz)  $(a_0, a_1, a_2, \dots, a_n)$   
 Pz :  
 ( )  $D(x) = a_0 + a_1 \cdot f_1(x) + a_2 \cdot f_2(x) + \dots + a_n \cdot f_n(x)$  ( )

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PCA

PCA

[ ]

PCA(0)

( )

PCA(1)

[ ] PCA

PCA

MATLAB

(PCA(1) PCA(0) )

<sup>38</sup>(MLP)

( )

z

(z)

[ ] <sup>37</sup>(PCA)

MLP

)

( MLP

(z)

MLP

MLP

:

MLP :

z

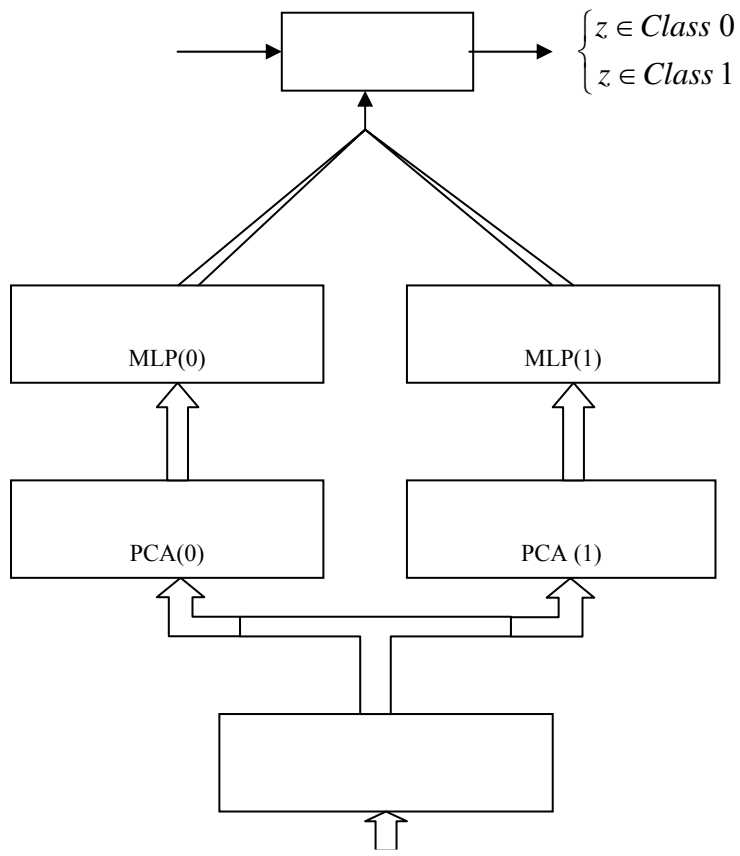
MLP :

z MLP

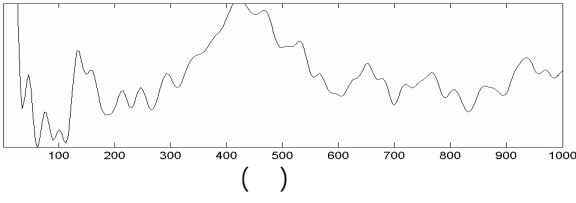
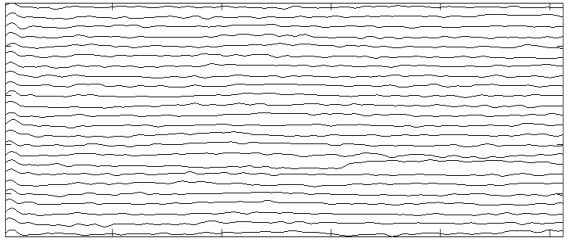
( ) z

(MLP )

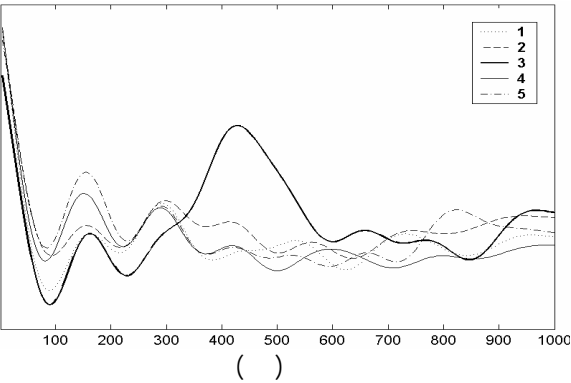
MLP



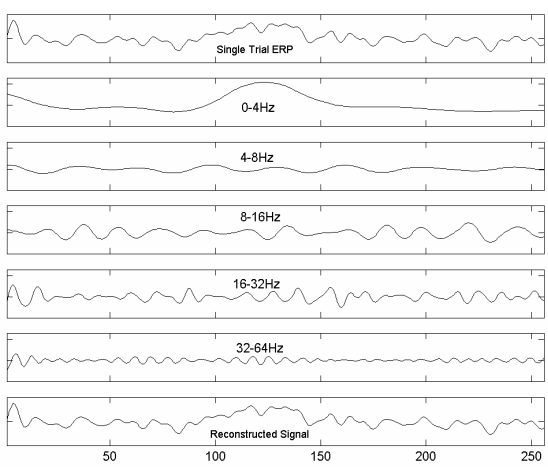
[ ]



( )  
ERP  
(Pz )



( )  
( )  
( )



ERP

ERP

Pz

(.

P300

Pz

ERP

T -test

T-value

) %

( p-value

%

p-

/ value

/ p-value

Cz Pz

/

(trgt=1) / (trgt=0)

/

/ p-value

:

{FD62 CD62 PD62}

{CD187 PD187}

{FD312 CD312 PD312}

{FD437 CD437 PD437}

{CD687 PD687}

{FD812 CD812 PD812}

{CT312 PT312}

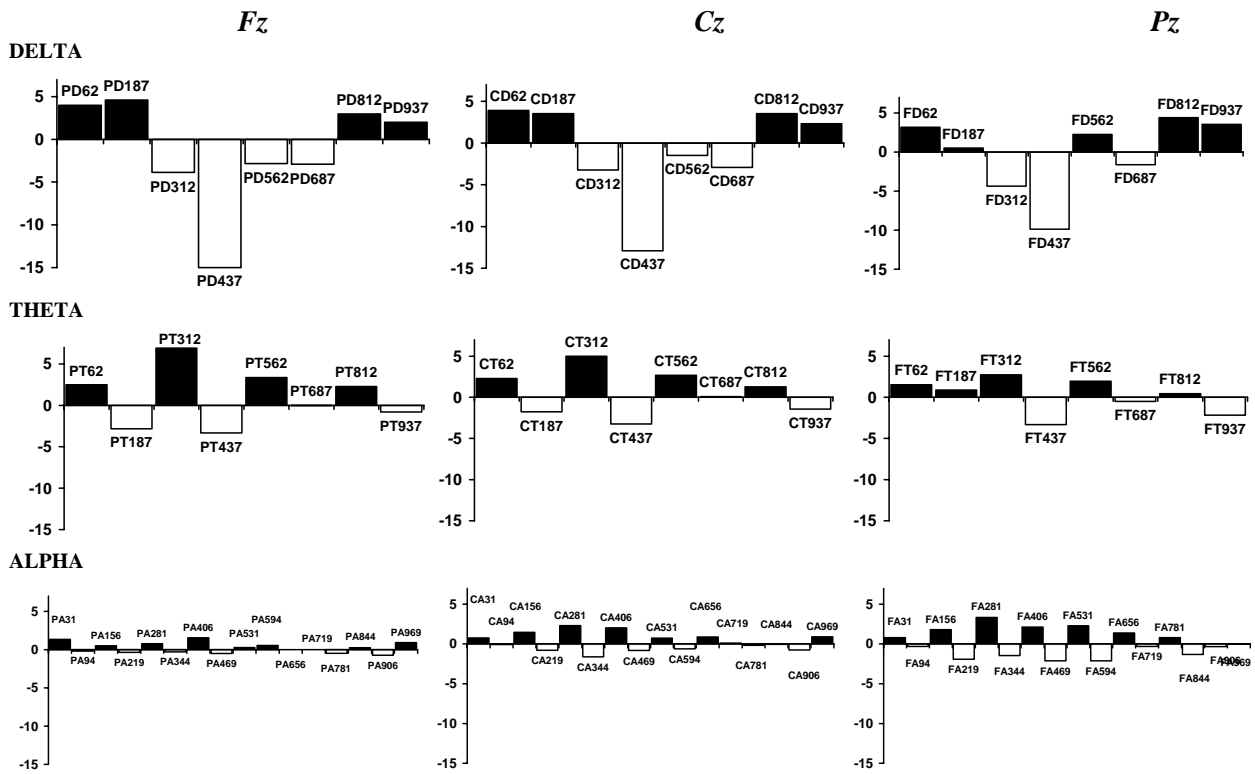
{FT437 CT437 PT437}

l. /)

/ (

).

%



T-value

(. /

Pz

P300

%

%

( )

Pz

Pz

PCA

/ /

/

MLP



( )

( )			
	/	/	
	/	/	
% / :			

( )

( )	
PD437	/
FD312	/
CD437	/
PT312	/
PD62	/
FT937	/
FD937	/
PD187	/
FA531	/
<b>(Constant)</b>	/

( )

( )			
	/	/	
	/	/	
% / :			

( )

( )	
PD437	/
PD562	/
FD312	/
PD62	/
PT312	/
FD562	/
FT187	/
CT187	/
PD187	/
<b>(Constant)</b>	/

Pz

( )

( )			
	/	/	
	/	/	
% / :			

( )

( )	
PD437	/
PD62	/
PT312	/
PD562	/
PD187	/
PT937	/
PD312	/
PA406	/
PA719	/
<b>(Constant)</b>	/

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/

MLP

( )

MLP

)

MLP

(z

)

(

Oddball

)

(

P300

ERP

P300

( )

z

MLP

( )

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<sup>39</sup>Subprocess

(%)		(%)		
				z MLP :
				* z MLP :
				:

/ z

\*

(FA281)

FD312      FD562   PD562   PD437      P300      P300

PT312      P300      P300

P3b   P3a      P300      P300      P300

P3a .[ ]      P300

P3b      P300

P3a      P300

P3b

<sup>40</sup>Online

P300

P300

P300

P300 S/N P3a P3b P3a

P300 ERP P3b

Quiroga T-value

Quiroga .[ ] FT312 FD437 CD437 PD437 CT312 PT312

T-test

P300

P300 P300 (Pz )

P300

P300 S/N MLP

P300

ERP P300 ERP

ERP EEG ) P300

<sup>41</sup>(ICA) (.

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<sup>41</sup>Independent Component Analysis

- [10] Rosenfeld JP; Event-related potentials in detection of deception; Psychology Department; Northwestern University; Evanston; IL 60208, USA; 1999; ([www.psych.nwu.edu/psych/people/faculty/rosenfeld/](http://www.psych.nwu.edu/psych/people/faculty/rosenfeld/))
- [11] Farwell LA, Donchin E; The truth will out: interrogative polygraphy ('lie detection') with event-related brain potentials; *Psychophysiology* 1991; 28(5):531-547.
- [12] Allen JJ, Iacono WG; A comparison of methods for analysis of event-related potentials in deception detection; *Psychophysiology* 1997; 34:234-240.
- [13] [www.brainwavescience.com](http://www.brainwavescience.com)
- [15] Jansen BH, Allam A, Kota P, Lachance K, Oscho A, Sundarsan K; An exploratory study of factors affecting single trial P300 detection; *IEEE Transactions on Biomedical Engineering* 2004; 51(6):975-978.
- [16] Quiroga RQ; Quantitative analysis of EEG signals: time-frequency methods and chaos theory; PhD. Thesis; Medical University of Lübeck; Germany; 1998.
- [17] Quiroga RQ, Sakowitz OW, Basar E, Schurmann M; Wavelet transform in the analysis of frequency composition of evoked potentials; *Brain Research Protocols* 2001; 8:16-24.
- [18] Ademoglu A, Micheli\_Tzanakou E, Istefanopulos Y; Analysis of pattern reversal visual evoked potentials (PRVEP's) by spline wavelets; *IEEE Transactions on Biomedical Engineering* 1997; 44(9):881-890.
- [19] Demiralp T, Istefanopulos Y, Ademoglu A, Yordanova J, Kolev V; Analysis of functional component of P300 by wavelet transform; *Proceedings of 20<sup>th</sup> International Conference of IEEE/EMBS* 1998; 20(4):1992-1995.
- [20] Haykin S, Thomson DJ; Signal detection in a nonstationary environment reformulated as an adaptive pattern classification problem; *Proceedings of IEEE* 1998; 86(11).
- [21] Fukunaga J; *Statistical pattern recognition*; 2nd ed. New York; Academic Press; 1990.
- [22] Yu HH, Hwang JN; *Handbook of neural network signal processing*; CRC Press; 2002.
- [23] Demiralp T, Ademoglu A, Istefanopulos Y, Basar-Eroglu C, Basar E; Wavelet analysis of oddball P300; *International Journal of Psychophysiology* 2001; 39:221-227.
- [24] Quiroga RQ, Garcia H; Single-trial event-related potentials with wavelet denoising; *Clinical Neurophysiology* 2003; 114:376-390.
- [1] Niedermeyer E, Lopes Da, Silva F; *Electoencephalography*; USA; Williams and Wilkins; 2000:637-655 & 1073-1091.
- [2] Basar E, Schurmann M, Demiralp T, Basar-Eroglu C, Ademoglu A; Event-related oscillations are 'real brain responses'- wavelet analysis and new strategies; *International Journal of Psychophysiology* 2001; 39:91-127.
- [3] Basar E, Basar-Eroglu C, Karakas S, Schurmann M; Gamma, alpha, delta, and theta oscillations govern cognitive processes; *International Journal of Psychophysiology* 2001; 39:241-248.
- [4] Basar E, Basar\_Eroglu C, Karakas S, Schurmann M; Are cognitive processes manifested in event-related gamma, alpha, theta and delta oscillation in the EEG?; *Neuroscience Letters* 1999; 259:165-168.
- [5] Farwell LA; Method and apparatus for truth detection; United State Patent; 1995; Patent Number: 5,406,956.
- [6] Miller AR, Baratta C, Weynveen C, Rosenfeld JP; False memory: P300 amplitude, topography and latency; Psychology Department; Northwestern University; USA; 1999; ([www.psych.northwestern.edu/psych/people/faculty/rosenfeld/publications.html](http://www.psych.northwestern.edu/psych/people/faculty/rosenfeld/publications.html)).
- [7] Polikar R, Greer MH, Upda L, Keinert F; Multiresolution wavelet analysis of ERPs for the detection of Alzheimer's disease; *Proceedings of 19<sup>th</sup> International Conference of IEEE/EMBS*; Chicago; IL; USA; 1997:1301-1304.
- [8] Polikoff JB, Bunnell HT, Borkowski WJ; Toward a P300-based computer interface; *Applied Science and Engineering Laboratories*; A. I. duPont Institute; Wilmington; ([www.asel.udel.edu/speech/reports/resna95/p300.pdf](http://www.asel.udel.edu/speech/reports/resna95/p300.pdf))
- [9] Bayliss JD; A flexible brain-computer interface; PhD. Thesis; University of Rochester; Rochester; New York; 2001.

EEG



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