



CAMPUS DE EXCELENCIA INTERNACIONAL

Disruptive healthcare technology: The case of Alzheimer Disease

Francisco del Pozo Centro de Tecnología Biomédica CTB Universidad Politécnica de Madrid UPM Parque Científico y Tecnológico de Montegancedo www.ctb.up.es





The disruptive condition of technology can arise from the aggregated application of several technologies, which normally act separately













#### **MEG** recordings





### Describing brain connectivity



Graph theoretical analysis

From Bullmore & Sporns, Nature Rev. 10, 186 (2009)



Functional networks: Time series

technologies to describe connectivity

### **1. CLASSICAL MEASURES**

- Cross-Correlation
- Correlation
- Coherence
- [C PARAMETERS]

### 2. PHASE SYNCRONIZATION MEASURES

- Phase Locking Value (PLV)
- Phase-Lag Index (PLI)
- Weighted Phase-Lag Index (WPLI)
- RHO
- [PS PARAMETERS]

### 3. GENERALIZED SYNCRONIZATION MEASURES

- S Index
- H Index
- N Index
- M Index
- L Index
- Synchronization Likelihood
- [GS PARAMETERS]

### **4. GRANGER CAUSALITY**

- Clasical Linear Granger Causality
- Direct Transfer Function (DTF)
- Partial Directed Coherence (PDC)
- [GC PARAMETERS]

### HERMES PLATFORM

#### http://hermes.ctb.upm.es/

Niso G, Bruña R, Pereda E, Gutiérrez R, Bajo R, Maestú F, del-Pozo F. "HERMES: towards an integrated toolbox to characterize functional and effective brain connectivity". Neuroinformatics. 2013 (4): 405-34. F.I: 3,136



#### HERMES a friendly software for connectivity analysis

| HERMES                             |   |                                |  |  |  |
|------------------------------------|---|--------------------------------|--|--|--|
| File Filter Visualization          |   | יני                            |  |  |  |
| - DATA SET                         | 148_200_cont           Trials 1         - Samples/Trial 200         - Time Epoch (ms) [0,332] | Centro de tecnologia biomédica |  |  |  |
| Basic Measures                     | - Phase Synchronization   | Granger Causality              |  |  |  |
| Correlation                        | Mean Phase Coherence Phase-locking Value  | Granger Causality              |  |  |  |
| Coherence                          | Phase-Lag Index Event-related Phase-Lag Index   | Partial Directed Coherence     |  |  |  |
| Cross-Correlation                  | Weighted Phase-Lag Index  | Directed Transfer Function     |  |  |  |
| B parameters                       | Rho PS parameters   | GC paramenters                 |  |  |  |
| - Information Theory               | Generalized Synchronization   |                                |  |  |  |
| Mutual Information                 | S M L Synchronization Likelyhood  | Run                            |  |  |  |
| IT paramenters                     | GS paramenters SL paramenters   | CANCEL                         |  |  |  |
| HERMES - Guiomar Niso (Julio 2011) |   |                                |  |  |  |

http://hermes.ctb.upm.es/



### Synchronization Likelihood



<u>Synchronization Likelihood</u> (Stam & van Dijk, 2002): Probability of coincidence in time of specific signal patterns in two time series X and Y

#### center for biomedical technology MCI vs Control differences

-CTI

B









#### MCI patients (ALPHA1 band)

84% (16/19) show frontal inter-hemispheric high S.L. values



2 SD above the baseline





A MEG-Functional Connectivity model in pathological aging (MCI)







Journal of Alzheimer's Disease 22 (2010) 183–193 DOI 10.3233/JAD-2010-100177 IOS Press

### Functional Connectivity in Mild Cognitive Impairment During a Memory Task: Implications for the Disconnection Hypothesis

Ricardo Bajo<sup>a,1,\*</sup>, Fernando Maestú<sup>a,b,1</sup>, Angel Nevado<sup>a,b</sup>, Miguel Sancho<sup>c</sup>, Ricardo Gutiérrez<sup>a</sup>, Pablo Campo<sup>a</sup>, Nazareth P. Castellanos<sup>a</sup>, Pedro Gil<sup>d</sup>, Stephan Moratti<sup>a,e</sup>, Ernesto Pereda<sup>f</sup> and Francisco del-Pozo<sup>a</sup>

Bajo R et al, Age, 2011 Buldu J, et al, PLOSone, 2011 Bajo R et al, Brain Connectivity, 2012



















- Α
- 1. Right Cingulate Gyrus, anterior division
- 2. Right Middle Temporal Gyrus
- 3. Right Lateral Occipital Cortex, inferior division
- 4. Right Occipital Pole
- 5. Left Supracalcarine Cortex
- 6. Left Lateral Occipital Cortex, inferior division

В

(López, Bruña et al, submitted)









Laboratory of cognitive and computational neuroscience Center for Biomedical Technology







### Modeling Brain Newtworks. Application to MCI/AD





Fig. 4. Percentage of variation and statistical significance. Percentage of variation of the average degree K, average shortest path L and its normalized value  $\hat{L} = \frac{L}{L_{ran}}$ , network outreach O and normalized outreach  $\hat{O} = \frac{O}{O_{ran}}$ , clustering C and normalized clustering  $\hat{C} = \frac{C}{C_{ran}}$  and network modularity. Circles correspond to p < 0.03 and stars to p < 0.001, specifically: O (p = 0.007),  $\hat{C} (p = 0.002)$ , Q (p = 0.0033), K,(p = 0.018),  $L_z$  (p = 0.025) and  $\hat{O} (p = 0.027)$ .

- The network strength *K* increases (+15.9%)
- Network outreach increases (+23.4%)
- The network modularity decreases (-13.5%)
- Normalized clustering decreases (-13.6%)
- Normalized outreach increases (+6.7%):



#### **Reorganization of Functional Networks in Mild Cognitive** Impairment

Javier M. Buldú<sup>1,2</sup>\*, Ricardo Bajo<sup>3</sup>, Fernando Maestú<sup>3</sup>, Nazareth Castellanos<sup>3</sup>, Inmaculada Leyva<sup>1,2</sup>, Pablo Gil<sup>4</sup>, Irene Sendiña-Nadal<sup>1,2</sup>, Juan A. Almendral<sup>1,2</sup>, Angel Nevado<sup>3</sup>, Francisco del-Pozo<sup>3</sup>, Stefano Boccaletti<sup>5,6</sup>

MCI

### **Computational Systems Biology**

center for

biomedical technology





From Left to right: Irene Sendiña-Nadal, Daniel de Santos, Juan A. Almendral, Javier M. Buldú, Inmaculada Leyva.





#### Center for biomedical technology

### Neuroimaging





*Neuroimaging Biomarkers in Aging and Dementia.* Application of volumetric techniques (Voxel-Based Morphometry, VBM) at different stages of neurodegenerative diseases.





Joven. 29 años Manciano 85 años Sano





Arterial Spin Labeling (ASL) using gold standards.





Second row: an 84year old healthy male. Left: caption obtained with PET; right: equivalent image obtained with ASL. Third row: images an 85-year old male with Alzheimer's disease.





Anciano 84 años Alzheimer

centro de tecnología biomédica



### Hippocampus volumetry





### **Difussion imaging**

| 🚹 🎦 Hootiks: site Texas i maging Avaijets (transmitting in the second maging avaijets (transmitting in the second maging available to the second maging a | odiks 🛗 🟠 🗃  | ) 🔹 🍓 😹 🖷 🖉 | ] 🔜 🔳 🔄                                   | 🛨  🔛 👬 • 🗱 • 🐼                    |  |            |                                      |   |  |            |
|--|--|-------------|---|-----------------------------------|--|------------|--------------------------------------|---|--|------------|
| 3DSlicer AlzTools  | Axtal<br>Axtal<br>Nose   |             | None                                      | Axtal Ovpert (Resampled) Labelmap |  | Note       | Axtal<br>Otipit (Recampled) Labelmap |   | Nove<br>Oktpot_Trace_Volume<br>R                     | 27.282     |
| Help & Acknowledgement   |  |             |   |                                   |  |            |                                      |   |  | 1          |
| <ul> <li>Diffusion Tensor Imaging Analysis (trunk)</li> </ul>  |  |             |   |                                   |  |            |                                      |   |  |            |
| Parameter set  |  |             |   |                                   |  |            |                                      |   |  |            |
| Status Idle  |  |             |   |                                   |  |            |                                      |   |  |            |
| ▲ Input  |  |             |   |                                   |  |            |                                      |   |  |            |
| Input volume (DICOM DWI series)  |  |             |   |                                   | diam.                                  |            |                                      | s                                       |  |            |
| ▲ Output   | i de la compañía de la | Self News   |   | 1.1.1                             | $\sim 3 \otimes \sim \sim$             | ÷          |                                      | ~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~ | ~ <u>~~</u>  |            |
| DVM_Volume   |  | 165 12      | 1. A. | L.                                | ᡗᢓᡁᢓ᠆ᢅᡃ                                |            | - E                                  | 5535                                    |  |            |
| Fractional_Anisotropy_Volume   |  |             |   |                                   | MAG                                    | - <u>}</u> |                                      |   |  |            |
| Output Trace Volume  | 1. 1.  |             |   | <u></u> 君田                        | AN1074                                 |            | <u>Z</u> LI                          |   |  |            |
| Temporary Directory  |  |             |   | $\mathbb{S}$                      | J7464 \ }                              | 8.2        | 53                                   | U YAYA                                  | $\sqrt{\frac{1}{2}}$                                 |            |
| Labelmap And Resampling  |  |             |   |                                   |  | V.F.A.     | रस्र                                 | ۲Å آ                                    | $\mathcal{V}\mathcal{F}_{\mathcal{F}_{\mathcal{F}}}$ | <b>a</b> ) |
| Input Labelmap None  |  |             |   |                                   |  | 2751       | (52)                                 | ATT                                     |  | • {        |
| Output (Resampled) Labelmap None   |  |             |   | 22                                |  | $\leq$     | 22                                   |   | <u>}</u>   | ·          |
| Resample labelmap to match DVV volume dimensions   |  |             |   | C.                                | 6225-                                  |            | 677                                  |   |  | ļ          |
|  |  |             |   | - E                               |  | E V        | 6                                    | As il                                   |  |            |
| Reference for EPI Correction (not required) None   |  |             |   |                                   | ~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~ | , .        |                                      |   |  |            |
| Perform EPI Correction   |  |             |   |                                   |  |            |                                      |   |  |            |
| Default Cancel Apply   |  |             |   |                                   |  |            |                                      |   |  |            |
|  |  |             |   |                                   |  |            |                                      |   |  |            |
| Manipulate Slice Views   |  |             |   |                                   |  |            |                                      |   |  |            |
| ▼ Manipulate 3D View   |  |             |   |                                   |  |            |                                      |   |  |            |







### **Difussion Tensor**







### Iron deposit quantification





### Spectroscopy. Molecular imaging





### **Tensor-based morfometry**





### Looking for biomarkers: image multimodality











### Neuroimaging Lab





From left to right: Susana Borromeo, Pablo García-Polo, Elena Molina, Eva Alfayate, José Ángel Pineda, Aranzazu Narciso, Juan Antonio Hernández-Tamames, Juan Álvarez Linera, Gonzalo Pajares, Norberto Malpica, Javier González, Andrea Rueda, Juan Francisco Garamendi, Miguel Hernández, Virginia Mato, Roberto Colom, Daniel García

## **TB** Center for biomedical technology for the early detection of AD: A multidimensional approach







Subjetive Memory Complaints (SMC)





### A MEG-Functional Connectivity model in pathological aging (SMC)





center for

biomedical

technology

В

AGE (2012) 34:497–506 DOI 10.1007/s11357-011-9241-5

### Early dysfunction of functional connectivity in healthy elderly with subjective memory complaints

Ricardo Bajo • Nazareth P. Castellanos • Maria Eugenia López • José María Ruiz • Pedro Montejo • Mercedes Montenegro • Marcos Llanero • Pedro Gil • Raquel Yubero • Evgenia Baykova • Nuria Paul • Sara Aurtenetxe • Francisco Del Pozo • Fernando Maestu



## **TB** Center for biomedical technology for the early detection of AD: A multidimensional approach









- Combination of anatomo functional connectivity
- Is the functional connectivity architecture depending on the integrity of the white matter?





B













The lower anisotropy value the lower the tendency to show a SW architecture in fc-MEG data



## Center for biomedical technology

### Relationship between neurophysiology and network scores





## **TB** Center for biomedical technology for the early detection of AD: A multidimensional approach







MEG-Functional connectivity as a potential marker of p-TAU in the CSF



#### **Position Paper**

#### Research criteria for the diagnosis of Alzheimer's disease: revising the NINCDS-ADRDA criteria

Bruno Dubois\*, HowardH Feldman\*, Claudia Jacova, Steven T DeKosky, Pascale Barberger-Gateau, Jeffrey Cummings, André Delacourte, Douglas Galasko, Serge Gauthier, Gregory Jicha, Kenichi Meguro, John O'Brien, Florence Pasquier, Philippe Robert, Martin Rossor, Steven Salloway, Yaakov Stern, Pieter J Visser, Philip Scheltens

Lancet Neurol 2007; 6:734-46 The NINCDS-ADRDA and the DSM-IV-TR criteria for Alzheimer's disease (AD) are the prevailing diagnostic

TAU concentration has been associated with neuronal damage and cognitive impairment



Center for biomedical technology MEG-Functional connectivity as a potential marker of p-TAU in the CSF





## TB Center for MEG-Functional connectivity as a potential marker of p-TAU in the CSF





## **TB** Center for biomedical technology for the early detection of AD: A multidimensional approach





Center for biomedical technology Biofuncionalization of magnetic nanoparticles as a MRI contrast agent of amyloid plaque in EA





## center for<br/>biomedical<br/>technologyDevelopment of selective contrast<br/>agents (RMI) for Alzheimer Disease



Different peptides have been conjugated with the magnetic nanoparticles to achieve a specific marker of the amyloid plaque. *in vitro* tests to evaluate the specific binding, affinity and toxicity of the conjugates.





Results obtained by an ELISA test carried out in P96 wells that have been previously treated with 1  $\mu$ g of a $\beta$ 1-42 peptide. The nanoconjugate NP-a $\beta$  shows an even higher affinity to bind to a $\beta$ 1-42 than the a $\beta$  peptide alone. Interestingly NPs alone do not show any affinity to binding to a $\beta$ 1-42.

Dextran coated magnetic nanoparticles (MNPs) can be detected efficiently by MRI in *ex vivo* and *in vivo* brains.

Challenges: highly stable in vivo; cross the Blood - Brain Barrier (BBB) non-destructively following intravenous injection; bind specifically to plaques with high affinity and produce local changes in tissue contrast detectable by MRI. Animal models: transgenic mice for AD (5xFAD)

#### Cellular & animal models: biomedical technology Cellular & animal models: Molecular Biology and Biochemistry

**∕**СТВ





From left to right: Frank Mikuski, Daniel González-Nieto, Milagros Ramos, Laura Fernández, Norma Ramírez, Soledad Martínez, José Luis Gaztelú-Quijano, Juan Barios, Ceferino Maestú, José M<sup>a</sup> Arguelles







From left to right: Nazaríao Féliz, Flavio Vinicio Changoluisa, Alfonso Muinelo, Ana Lorena Urbano, Rodolfo Maestre, Javier Serrano, Cristina Sánchez, Jorge Díaz Mateus.

## **TB** Center for biomedical technology for the early detection of AD: A multidimensional approach







## Functional connectivity and genetic profiles





## **TB** Center for biomedical technology for the early detection of AD: A multidimensional approach







It has been examined differences in functional connectivity between MCI and healthy controls with MEG at the group level.

- In order for MEG to be useful, it must be able to detect abnormal function at the level of the individual patient.
- -There were **two goals** to the present study:
  - To develop a model, using data mining techniques, that reliably distinguishes between MCI patients and healthy controls.
  - **Test this model** using an unseen dataset of MCI and control subjects acquired by the MAGIC-AD consortium.



Elekta-Neuromag supported the annual meeting of the consortium







Н









**Rik Henson** 

Akinori Nakamura Anto Bagic James Becker Gustavo Sudre



Ed Zamrini



Jyrki Mäkelä







Lauri Parkonen Eero Pekkonen Michael Funke



**Ricardo Bajo** 



**Pilar Garcés** 





Pablo Cuesta

Jose M Peña





- 1. Training datasets (known subjects)
- All data recorded (resting state) in Madrid
  MEG Datasets: 83 MCI and 54 controls
- 2. Validation datasets (Unseen/ blind study)
- Data recorded at five different MEG labs
  MEG data sets: 24 MCI and 28 controls





### Internal validation

| Real class      |             |             |        |          |  |
|-----------------|-------------|-------------|--------|----------|--|
| Prodicted class | MCI         | Control     |        |          |  |
|                 |             | Control     |        |          |  |
| MCI             | 65          | 15          | 81,25% | PPV      |  |
| Control         | 13          | 39          | 75,00% | NPV      |  |
|                 | 83,33%      | 72,22%      | 78,79% | Accuracy |  |
|                 | Sensitivity | Specificity |        |          |  |

### Analysis of MAGIC-AD DATA

center for

biomedical technology

**C**TB







Results of the data mining blind classification. MAGIC-AD DATA



### External validation

|                 | Real        |             |                      |          |
|-----------------|-------------|-------------|----------------------|----------|
|                 |             |             |                      |          |
| Predicted class | MCI         | Control     |                      |          |
|                 |             |             |                      |          |
| MCI             | 12 4        |             | 75,00%               | PPV      |
|                 |             |             |                      |          |
| Control         | 1           | 11          | 91,67%               | NPV      |
|                 |             |             |                      |          |
|                 | 92,31%      | 73,33%      | <mark>82,1</mark> 4% | Accuracy |
|                 |             |             |                      |          |
|                 | Sensitivity | Specificity |                      |          |





### External validation (Second Round)

**Real class** 

| Predicted class | MCI         | Control     |         |          |
|-----------------|-------------|-------------|---------|----------|
|                 |             | Control     |         |          |
|                 |             |             |         |          |
| MCI             | 11          | 4           | 73,33%  | PPV      |
|                 |             |             |         |          |
|                 |             |             |         |          |
| Control         | 0           | 9           | 100,00% | NPV      |
|                 |             |             |         |          |
|                 | 100,00%     | 69,23%      | 83,33%  | Accuracy |
|                 |             |             |         |          |
|                 | Sensitivity | Specificity |         |          |

### Fronto-parietal links achieving classification values



### Inter-hemisph links achieving classification values





### Data Mining and Simulation LAB



From left to right: (back row) Santiago González, Jorge Peña, Felix de las Pozas, , Juan Morales, Carlos Garcia, Santiago Muelas, Angel Garcia, Jesus Sanchez, (front row) Chema Peña, Victor Robles, Consuelo Gonzalo, Ernestina Menasalvas, Sandra Saez, Antonio Latorre, Juan Hernando.







SAGE-Hindawi Access to Research International Journal of Alzheimer's Disease Volume 2011, Article ID 280289, 10 pages doi:10.4061/2011/280289

#### **Review** Article

#### Magnetoencephalography as a Putative Biomarker for Alzheimer's Disease

Edward Zamrini,<sup>1</sup> Fernando Maestu,<sup>2</sup> Eero Pekkonen,<sup>3</sup> Michael Funke,<sup>1</sup> Jyrki Makela,<sup>4</sup> Myles Riley,<sup>1</sup> Ricardo Bajo,<sup>2</sup> Gustavo Sudre,<sup>5</sup> Alberto Fernandez,<sup>2</sup> Nazareth Castellanos,<sup>2</sup> Francisco del Pozo,<sup>2</sup> C. J. Stam,<sup>6</sup> Bob W. van Dijk,<sup>7</sup> Anto Bagic,<sup>8</sup> and James T. Becker<sup>8, 9, 10, 11</sup>

## **TB** Center for biomedical technology for the early detection of AD: A multidimensional approach







#### Cajal Blue Brain Project





From left to right: Gonzalo León, Pilar Flores, Isabel Merchán, Diana Sánchez, Lorena valdés, Ángel Merchán, Ana Isabel García, Ruth Benavides, Rodrigo Pérez, Miguel Miguens, Javier DeFelipe, Lidia Alonso, Paula Merino, Alberto Muñoz.

# Diminished perisomatic GABAergic terminals on cortical neurons adjacent to amyloid plaques

Virginia Garcia-Marin<sup>1,2†</sup>, Lidia Blazquez-Llorca<sup>1,2†</sup>, José-Rodrigo Rodriguez<sup>1,2</sup>, Susana Boluda<sup>3</sup>, Gerard Muntane<sup>3</sup>, Isidro Ferrer<sup>3</sup> and Javier DeFelipe<sup>1,2\*</sup>





(Jack et al, 2010; Sperling et al, 2011)