Multiscale organization and modeling of cerebellum

insights and perspectives for motor learning and control

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High performance in skilled movements requires the cerebellum

 \rightarrow Real -time high-speed control of movement requires special circuit properties. In the brain this control is performed in circuit loops involving the **cerebellum**

 \rightarrow The **cerebellum** learns to predict the sensory consequences of a motor action

 \rightarrow The **cerebellum** performs high-order correlations among spatio-temporally organized activity patterns

In the example of the pianist, the over 600 mucles of the body are corrdinated in highly ordered sequences under multisenorail control. The sequences have been learned and optimized through a trial-and-error process. The system is highly automatized and make s the pianist free to concentrate on the interpretation .



The when, what and how of cerebellum

While the cerebellum has been classically associated to the control of movement and its pathological counterpart, **ataxia**, it has recently been related also to **cognitive processing** and supposed to be involved in **autism**, **dyslexia**, **multiple sclerosis and Alzheimer disease** just to mention some. And it could also be specifically involved in epilepsy !

The way of understanding the **when, what and how** of cerebellum is changing ! Not just a motor structure but one that integrates in major brain loops involved in a variety of functions and pathologies.

→There is a urge to represent the cerebellum at different levels and to integrate it into large-scale brain models *!!*

The cerebellum is deeply interconnected to cerebral cortex



Graphical elaboration - Courtesy of Nick Rolandi

Palesi F, De Rinaldis A, Castellazzi G, Calamante F, Muhlert N,

Chard D, Tournier JD, Magenes G, D'Angelo E, Gandini Wheeler-Kingshott CAM. **Sci Rep. 2017**

The cerebellum is engaged in sensori-motor tasks (finger tapping)

The task employed in this initial experiment was indeed demanding: 1 min of **self-paced finger taping** requires motor planning and concentration.

GM - M1 (BA4) ... BA2 ... BA6... anterior cerebellum ... Crus I/II, Iobule VI, and Iobule VIIIa, WM, - CST ... superior longitudinal fasciculus ... CC.





PERSPECTIVE published: 09 November 2018

Challenges and Perspectives of Quantitative Functional Sodium Imaging (fNal)

Claudia A. M. Gandini Wheeler-Kingshott^{1,2,3+t}, Frank Riemer^{1,4+}, Fulvia Palesi⁵, Antonio Ricciardi^{1,6}, Gloria Castellazzi^{1,7}, Xavier Golay⁸, Ferran Prados^{1,6,9}, Bhavana Solanky¹ and Egidio U. D'Angelo^{2,10}

The cerebellum is engaged in both sensorimotor and cognitive tasks



Letizia Casiraghi , Adnan AS Alahmadi, Anita Monteverdi, Fulvia Palesi , Gloria Castellazzi, Giovanni Savini, Karl Friston, Claudia AM Gandini WheelerKingshott , Egidio D'Angelo. **Cerebral Cortex, 2018**,.

The cerebellum is engaged in both sensorimotor and cognitive resting-state networks

oscillations Resting-state fMRI – Very-low frequency coherent





Toosy⁵, Letizia Casiraghi^{3,6} Egidio D'Angelo^{3,6†} and Claudia Angela Michela Gandini Wheeler-Kingshott^{1,6,91} Ahmed T. Bruno⁴ Stefania D. Giovanni Savini^{3,8}, Gloria Castellazzi^{1,2,3*} Fulvia Palesi7,

Front Cell Neurosci, 2018

The cerebellum is engaged in continuous cognitive processing



Ahmed T. Toosy⁵, Letizia Casiraghi^{3,6}, Egidio D'Angelo^{3,6†} and Claudia Angela Michela Gandini Wheeler-Kingshott^{1,6,91} Bruno⁴, Stefania D. Fulvia Palesi7, Giovanni Savini^{3,8}, Gloria Castellazzi^{1,2,3*}

Front Neurosci, 2018

In MCI and AD, relevant alterations occur in cerebellum functional connectivity

WHEN



Gloria Castellazzi^{1,2}*, Fulvia Palesi^{2,3}, Stefano Casali^{2,4}, Paolo Vitali⁵, Elena Sinforiani⁶, Claudia A. M. Wheeler-Kingshott⁷* and Egidio D'Angelo^{2,4}* Front Neurosci, 2014

The cerebellum operates both as an inverse and a forward controller



The cerebellar forward controller is thought to learn to predict the precise timing of correlated events. How does the cerebellum do it ?



The cerebellum is organized in modules operating through a generalized computational algorithm

> The generalized algorithm, depending on the brain regions to which a given module is connected, can lead to different behavioral consequences.

D'Angelo et al., 2013, 2016 – **Frontiers in Cellular Neuroscience**

Marr-Albus-Ito develop the Motor Learning Theory predicting that cerebellar learning occurs through plasticity at the PF-PC synapses under CF control



"For me the most significant property" of the cerebellar circuitry would be its plastic ability, whereby it can participate in motor learning, that is the acquisition of skills. This immense neuronal machine with the double innervation of Purkinje cells begins to make sense if it plays a key role in motor learning... it could be optimistically predicted that the manner of operation of the cerebellum in movement and posture would soon be known in principle" (J.C. Eccles, from the foreword to Ito, 1984).

But Marr: (D'Angelo, in Ito and Vaina 2016)

- **!!) does not consider other forms of plasticity**
- **!!)** does not consider neuronal firing dynamics and molecular complexity
- **!!**) does not consider geometry (only topology and statistics)

Non-linear neuron properties in the granular layer



Forti et al., 2006.













Gandolfi et al, 2013; Solinas et al., 2007; D'Angelo et al., 2001

Theta-band oscillation - resonance - plasticity hypothesis



- -Theta-band oscillating transmitter: cortico-thalamic system -Theta-band resonant receiver: granular layer - Theta-band plasticity
- encoder





This example shows complex and multiple properties of neurons, whose understanding requires integration into realistic <u>models</u> considering:

Detailed description of microscopic properties
Connection of neurons into large-scale networks

and eventually

3) Simplification of models

4) Embedding into large-scale circuits

5) Reconstruciton and analysis of integrated brain signals and functions

From the lab to models, simulations and back again





Realistic neuron models are based on mathematical representations of molecular mechansims (e.g. ionic ionic chanlles and receptors) and neuronal morphology



Spike initiation and propagation in granule cell axon



Spatio-temporal dynamics in the granular layer microcircuit



THE CEREBELLUM SCAFFOLD MODEL





. distance (µm) GrC radius GoC radius PC radius SC radius BC radius

THE CEREBELLUM SCAFFOLD MODEL Cell connectivity



THE CEREBELLUM SCAFFOLD MODEL Cell activity



THE CEREBELLUM SCAFFOLD MODEL Activity propagation



THE CEREBELLUM SCAFFOLD MODEL Spatial organization of responses in the granular layer



THE CEREBELLUM SCAFFOLD MODEL Temporal organization of responses in the granular layer



THE CEREBELLUM SCAFFOLD MODEL Propagation of responses to the molecular layer



THE CEREBELLUM SCAFFOLD MODEL Implementation with E-GLIF neurons and plasticities (in progress)



2BC learning results from the interaction of multiple mechanisms at different scales

A. Geminiani, C. Casellato, H.-J. Boele, C.I. De Zeeuw, A. Pedrocchi, E. D'Angelo – in preparation

-The scaffold can account for flexible handling of cell positioning connectivity and learning rules accouning for the data provided by experiments

-The scaffold implemented with LIF neurons already shows the emergence of local network dynamics revealed experimentally

-The further implementation with E-GLIF neurons and REALISTIC NEURONS is needed to investigiate non-linear spatio-temporal dynamics during continuous signal processing

Synaptic plasticity and dynamic network processing in robots

Plasticity occurs at 3 main sites in the cerebellar network:

granular layer
molecular layer
DCN

These plasticities are bidirectional and depend on spike timing

Hansel, Linden, D'angelo, Nature Neurosci, 2001 D'Angelo nd DeZeeuw, TINS 2010 D'Errico et al., J Physiol, 2008 Sgritta et al., J Neuosci, 2017



A plastic SNN of the cerebellum in the control system of a neuro-robot



- Simplified network (1 small module, 10000 neurons)
- Simplified neurons (LIF)
- Simplified learning rules (3 bidirectional STDP)

Prediction of Purkinje cells and DCN cell dynamics during EBCC learning

-The cerebellum opeates as an inverse controller correcting movement coordination through the identification and earning of correlated sensory events.

-the cereblelum uses distributed bidirectional synatic plasticity to control learning in a biologically meaningful manner

-Plasticity is managed dynamically with faster time constnat in the cerebellar cortex that in the DCN



Fallout and planning for 2019-2021

Implementaiton in REAL ROBOTS - <u>NAO</u> <u>NAO</u>

Test the oscillation/resonance/plasticity hypothesis and other moelcular/cellular hypotheses with the network with enhanced dynamics and robotic models.

But, for further understanding of the brain-cerebelum system, 3 operations are being developed in parallel :

- A) fully develop bottom-up modeling toward whole-brain (doable for robotic implementations in mice)
- B) integrate bottom-up with top-down modeling (typically needed to interpret human data)
- C) Instruct bottom-up models at different scales using bioophisically meanngful featires (BMF) from MRI to predict microcircuit alterations in pathology

(A) BOTTOM-UP INFERENCE of fMRI signals

Implement the scaffold into the virtual mouse brain model with full bottom-up reconstruction of the ensemble signals





(B) MODEL INVERSION in the Virtual Brain - humans Implement novel neural masses or mean-field equations keeping an explicit connection to data-driven models and Integrate them into The Virtual Brain to simulate the contributions of elementary mechanisms to ensemble brain signals (e.g. fMRI, EEG).



(C) INSTRUCTION/PREDICTION – human pathology Information derived from MIP classification is used in data-driven models to predict neuronal and network parameter changes in human brain pathologies.



MILESTONES

2018

Definition of methods for NVC investigation
 Achieved at end of 2017 – paper published on J Neuoscience (Mapelli et al., 2017)
 Definition of mechasims of NVC in the cerebelum
 Achieved – new data sampling concluded and paper in preparation on the comparison of differnt cerebellar regions – Abstracts at FENS, Berlin, July 2018; Abstrct and poster at Erice School "Camillo Golgi", December 12-15, 2018.

Initial models of NVC

Achieved - First model version generated – advanced module for pyNEURON under development .

2019-2021

- 1) Definition of the NA / NVC relationship in the cerebellum
- 2) "fMRI module " of cerebellum to reconstruct the fMRI-BOLD signal.
- 3) "Neural mass and mean-field models" of cerebellum to analyze the fMRI-BOLD signal.

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