

The role of neuroimaging beyond T1-weighted MRI in the diagnosis and prediction of neuropsychiatric disorders

Esten H. Leonardsen

26.10.23



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1. Background: Defining the scope of the lecture.
2. State-of-the-art: How is neuroimaging beyond T1-weighted MRI currently being used with respect to neuropsychiatric disorders.
3. The future: Challenges and opportunities in using neuroimaging for predicting neuropsychiatric disorders moving forward.

- The role of neuroimaging beyond T1-weighted MRI in the diagnosis and prediction of neuropsychiatric disorders



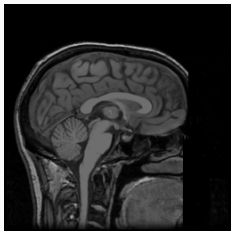
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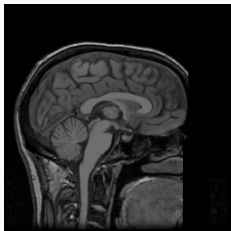
Bert from FreeSurfer 7.3



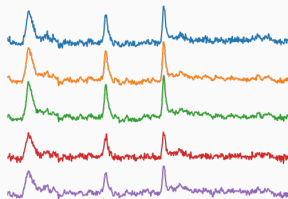
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Bert from FreeSurfer 7.3



Sample from the MNE library



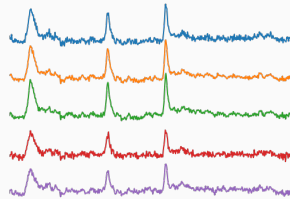
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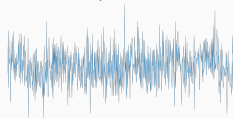
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Bert from FreeSurfer 7.3



Sample from the MNE library



Sample from Tremblay et al., 2016



Tremblay, R., Lee, S., & Rudy, B. (2016). GABAergic interneurons in the neocortex: from cellular properties to circuits. *Neuron*, 91(2), 260-292



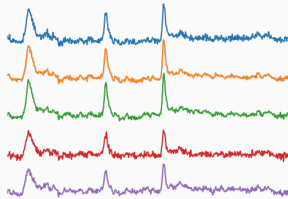
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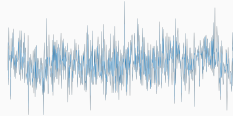
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Meta Quest Pro



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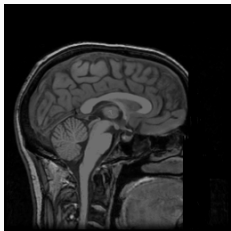


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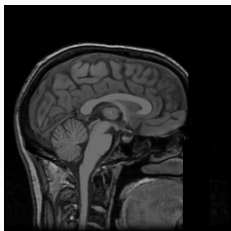
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Bert from FreeSurfer 7.3



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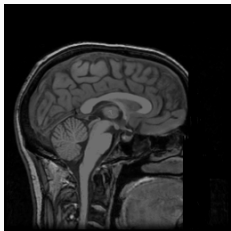
Bert from FreeSurfer 7.3

3D



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Bert from FreeSurfer 7.3

Saggital, axial



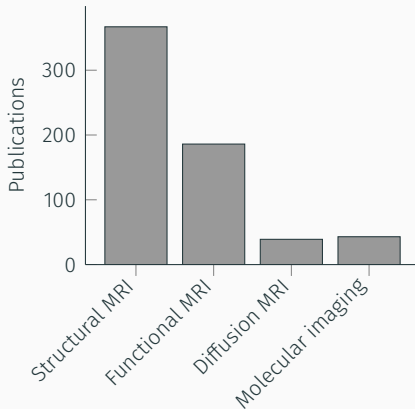
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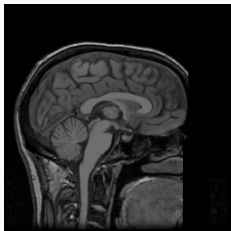
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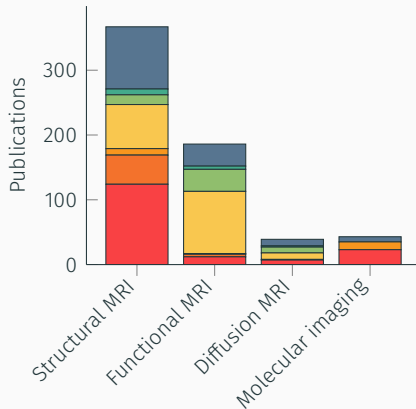
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Bert from FreeSurfer 7.3



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The role of neuroimaging beyond T1-weighted MRI in the diagnosis and prediction of neuropsychiatric disorders

Alzheimer's disease (AD) and other
causes of dementia (DEM)

Multiple Sclerosis (MS)

Parkinson's Disease (PD)





The role of neuroimaging beyond T1-weighted MRI in the diagnosis and prediction of neuropsychiatric disorders

Alzheimer's disease (AD) and other
causes of dementia (DEM)

Bipolar Disorder (BP)

Multiple Sclerosis (MS)

Schizophrenia (SCZ)

Parkinson's Disease (PD)

Depressive disorders, including
major depressive disorder (MDD)



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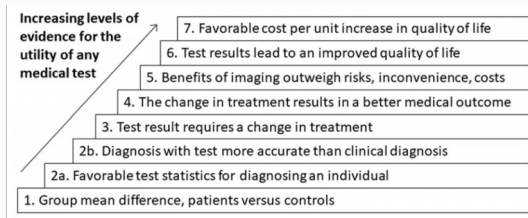
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Vogel & Black (2024)

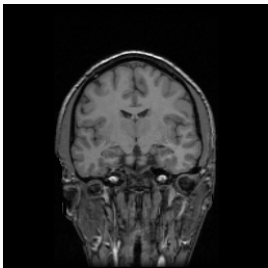


Vogel, A. C., & Black, K. J. (2024). Brain Imaging in Routine Psychiatric Practice. *Missouri Medicine*, 121(1), 37



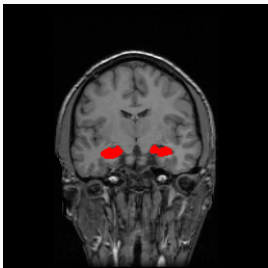
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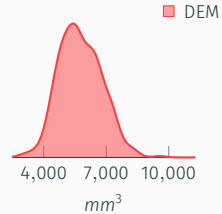
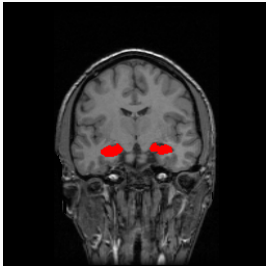
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Data from ADNI

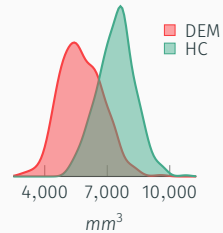
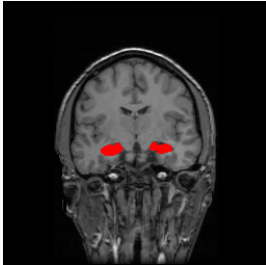
Jack Jr, C. R., Bernstein, M. A., Fox, N. C., Thompson, P., Alexander, G., Harvey, D., ... & Weiner, M. W. (2008). The Alzheimer's disease neuroimaging initiative (ADNI): MRI methods. *Journal of Magnetic Resonance Imaging: An Official Journal of the International Society for Magnetic Resonance in Medicine*, 27(4), 685-691



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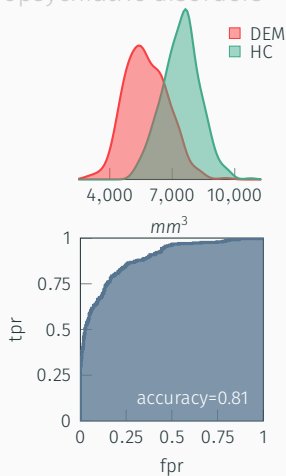
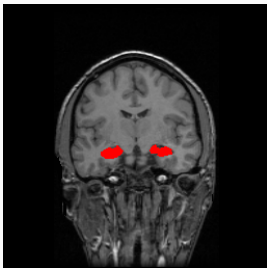
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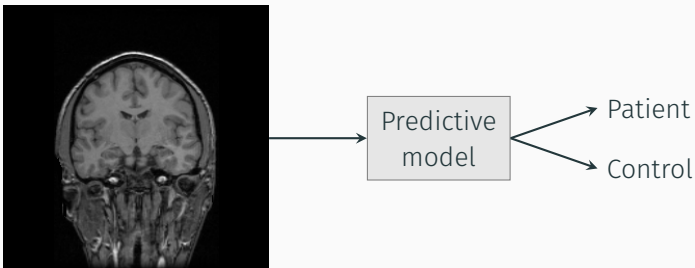


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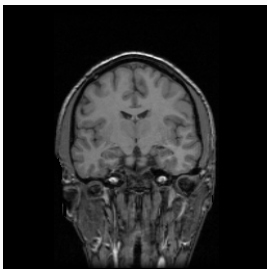
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$$\text{accuracy} = \frac{\text{correct predictions}}{\text{all predictions}}$$



Neuroimaging modalities for diagnostic predictions



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Approach

Non-T1 structural MRI

Diffusion MRI

Functional MRI

Molecular imaging

Approach

Non-T1 structural MRI

Diffusion MRI

Functional MRI

Molecular imaging

Dementia

Multiple sclerosis

Parkinson's disease

Schizophrenia

Major depressive disorder

Bipolar disorder

Approach

Non-T1 structural MRI

Diffusion MRI

Functional MRI

Molecular imaging

Dementia

Multiple sclerosis

Parkinson's disease

Schizophrenia

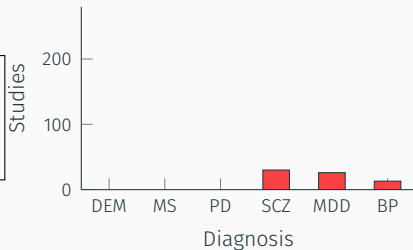
Major depressive disorder

Bipolar disorder



From estimating activation locality to predicting disorder: A review of pattern recognition for neuroimaging-based psychiatric diagnostics

Thomas Wolfers^{a,b}, Jan K. Buitelaar^{c,d}, Christian F. Beckmann^{b,c,e}, Barbara Franke^{a,f},
Andre F. Marquand^{b,g}



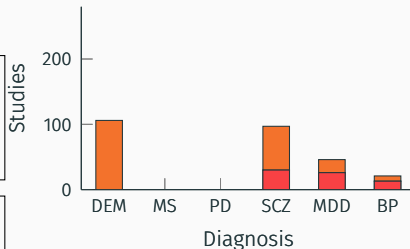


From estimating activation locality to predicting disorder: A review of pattern recognition for neuroimaging-based psychiatric diagnostics

Thomas Wolfers^{a,b}, Jan K. Buitelaar^{c,d}, Christian F. Beckmann^{b,c,e}, Barbara Franke^{a,f}, Andre F. Marquand^{b,g}

Single subject prediction of brain disorders in neuroimaging: Promises and pitfalls

Mohammad R. Arbabshirani^{a,b}, Sergej Plis^b, Jing Sui^{b,c}, Vince D. Calhoun^{a,d}





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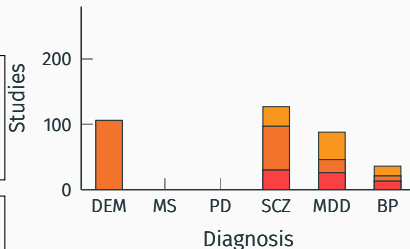
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Towards a brain-based predictive model of mental illness

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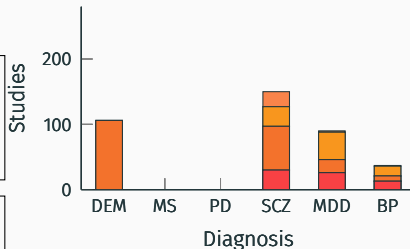
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Towards a brain-based predictive of mental illness

Barnaby Rashid, Vince Calhoun

Deep learning applications for the classification of psychiatric disorders using neuroimaging data: Systematic review and meta-analysis

Miriam Quak¹, Laurens van de Mortel², Rajat Mani Thomas³, Guido van Wingen²





Deep learning to detect Alzheimer's disease from neuroimaging: A systematic literature review

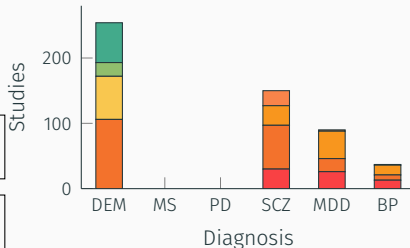
Mr Amir Ebrahimighavneh¹, Suhui Luo¹, Raymond Chiong²

Machine learning techniques for diagnosis of alzheimer disease, mild cognitive disorder, and other types of dementia

Golrokh Mirzoei¹, H. Hossain Adeli²

Early diagnosis of Alzheimer's disease based on deep learning: A systematic review

Sina Fathi¹, Maryam Ahmadi², Alsanesh Dehdad³



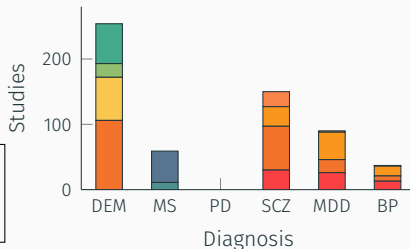


Applications of deep learning techniques for automated multiple sclerosis detection using magnetic resonance imaging: A review

Afsheen Shoaibi ¹, Marjane Khodatars ², Mahboobeh Jafari ³, Parisa Moridian ⁴, Mitra Rezaei ⁵, Roohallah Alizadehsani ⁶, Fahime Khozeimeh ⁶, Juan Manuel Gorriz ⁷, Jonathan Heras ⁸, Maryam Panahiazar ⁹, Seid Nahavandi ⁶, U Rajendra Acharya ¹⁰

Multiple Sclerosis Diagnosis Using Machine Learning and Deep Learning: Challenges and Opportunities

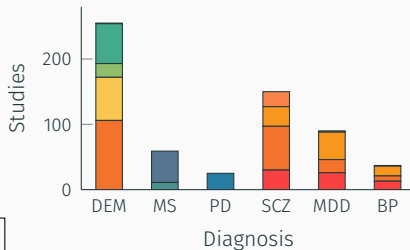
by Nida Aslam ¹ , Irfan Ullah Khan ¹ , Asma Bashamakh ¹, Fatima A. Alghosbi ¹, Menna Aboumour ¹ , Noorah M. Alsweyan ¹, Rawad K. Alkuraf ¹, Samiha Brahimi ², Sumayh S. Aljameel ¹ and Kholoud Al Ghamdi ¹





Role of Artificial Intelligence Techniques and Neuroimaging Modalities
in Detection of Parkinson's Disease: A Systematic Review

Nikita Aggarwal¹ • B. S. Saini¹ • Savita Gupta²



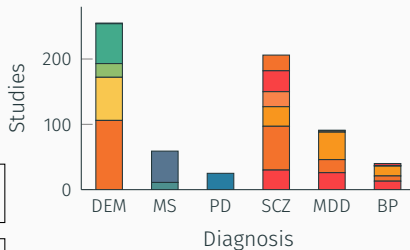


Machine learning techniques in a structural and functional MRI diagnostic approach in schizophrenia: a systematic review

Ricardo de Fátima,^{1*} Elvira Anna Carbone,^{1*} Raffaele Gaetano,¹ Antonella Bruni,¹ Valentina Pugliese,¹ Cristina Segura-García,² and Pasquale De Fazio¹

Machine learning techniques for the Schizophrenia diagnosis: a comprehensive review and future research directions

Shradha Verma¹ · Tripti Goel¹ · M. Tanveer² · Weiping Ding³ · Rahul Sharma¹ · R. Murugan¹





Will machine learning applied to neuroimaging in bipolar disorder help the clinician? A critical review and methodological suggestions

Laurie-Anne Claude, Josselin Houerou , Edouard Duchesnay, Pauline Favre

