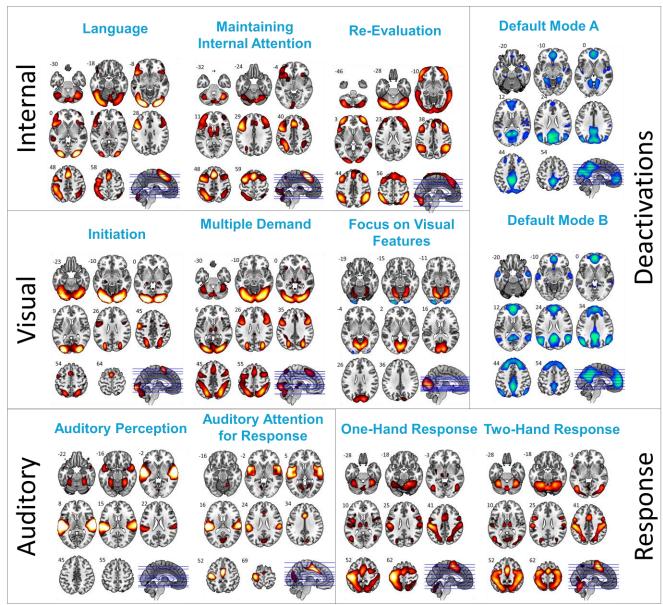
Cognitive Modes Detectable with Task-Based fMRI Chantal M. Percival, Linda Chen, Hafsa B. Zahid & Todd S. Woodward Department of Psychiatry, University of British Columbia, Canada August 16, 2024



Citation: Percival, C.M., Chen, L., Zahid, H.B., & Woodward, T.S. (2024, August 16). Cognitive Modes Detectable with Task-Based fMRI. Zenodo. http://doi.org/10.5281/zenodo.4274397

The goal of this work was to observe replicability of task-based cognitive modes over a range of tasks using patterns (as opposed to coordinates), by way of inspection of the task-induced blood-oxygen dependent (BOLD) signal changes over a range of cognitive tasks. This pattern-based anatomical methodology is an alternative to the traditional coordinate-based methodology (Lancaster et al., 2000), and provides an efficient way to communicate the configuration of hundreds or thousands of voxels with one pattern. The cognitive-mode approach involves evidence-based observation of the task-induced BOLD changes over a wide range of tasks and task conditions. These anatomical and functional goals were achieved by re-analysis of fMRI data collected in our laboratory and others', from both published and unpublished studies, and working towards definition of cognitive modes by observing BOLD signal change associated with a set of anatomical patterns over a range of tasks and task conditions.

fMRI-CPCA Overview

Constrained principal component analysis for functional magnetic resonance imaging (fMRI-CPCA) was employed to extract the anatomical and temporal data on which the 12 prototypical cognitive modes are based. fMRI-CPCA follows four fundamental principles used to analyze task-based fMRI data: (1) variance in the BOLD data submitted to dimension reduction is constrained to that related to task timing, (2) an assumed model of the hemodynamic response (HDR) is not used, (3) multivariate analysis of eigenvalue-based patterns across voxels is used, and (4) no parcellations, regions of interest (ROI), or pre-determined network masks are imposed, allowing genuine whole-brain analysis.

The theory and proofs of CPCA are detailed in previously published work (Hunter & Takane, 2002; Lavigne, Rapin, et al., 2015; Metzak et al., 2011; Metzak et al., 2012; Takane & Hunter, 2001; Whitman et al., 2013; Woodward et al., 2013) and comparisons with other multivariate methods are described in Metzak et al. (2011). A general overview of the mathematical steps for fMRI data is provided on the subsequent page, and the software code is freely available online at https://www.nitrc.org/projects/fmricpca.

Conceptually, fMRI-CPCA combines multivariate multiple regression analysis and principal component analysis (PCA) into a unified framework. Multivariate multiple regression isolates variance in BOLD signal predicable from the independent variables that are the design matrix. Then PCA is performed on the matrix of predicted scores

The PCA component loadings are interpreted spatially, depicting the brain patterns, and the PCA component score temporally, depicting task-induced BOLD changes. The component scores provide a value indexing the activity of each brain network for every brain scan (TR). They are regressed onto the Finite Impulse Response (FIR) model matrix to obtain predictor weights for every participant in each condition in each component. Then, the predictor weights are plotted to produce task-induced BOLD changes. Thus, through fMRI-CPCA, we are able to (1) identify multiple functional brain networks that are simultaneously involved in a cognitive task, (2) estimate the task-induced BOLD changes following stimulus presentation for each cognitive mode separately for each participant and condition, and (3) statistically test the effect of task conditions on estimated task-induced BOLD changes for each functional brain network using ANOVAs.

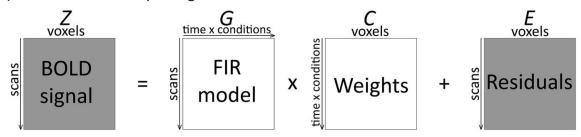
Mathematical steps of fMRI-CPCA.

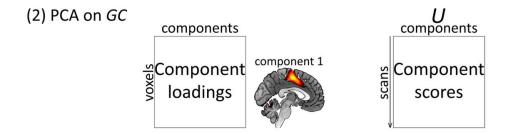
Step 1: Multivariate least-squares regression of blood oxygen level-dependent (BOLD) intensity values, Z, onto finite impulse response (FIR) basis set, G (performed for each participant). The value 1 is placed in cells of G for which BOLD signal is to be estimated, and the value 0 in all other cells. The C matrix, where $C = (G'G)^{-1}G'Z$, comprises condition-specific regression weights. GC represents the variability in Z that is predictable from G (i.e., the task-related variability in BOLD signal). Individual participant GC matrices are concatenated to create the resulting GC matrix in the following step.

Step 2: Singular value decomposition (of which PCA is a special case) is used to extract components in *GC* that represent temporally orthogonal functional brain networks in which coordinated BOLD activity is directly related to the task timing. This also produces a matrix, *U*, containing the component scores for each participant. Anatomical regions are visualized by overlaying thresholded component loadings onto a brain template.

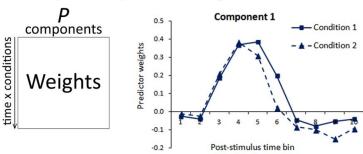
Step 3: For each participant, component scores (U) are regressed onto G to produce predictor weights (P) estimating the intensity of the component at each time bin coded in G.

(1) Multivariate multiple regression





(3) Regress *U* onto *G* to produce predictor weights



fMRI Measures of Cognitive Functions

These brain image templates were created by averaging over exemplars of each cognitive mode. Publications containing these cognitive modes are listed below. Any fMRI-CPCA derived mode pattern can be automatically classified into those depicted in Figure 1 by a MATLAB-based algorithm. This involved digitizing 20-30 brain slices prototypical of each of cognitive mode, and correlating newly derived images with those prototype slices, and classifying based on the magnitude of the correlations. The functions of these cognitive modes are determined by cross-interpreting BOLD changes over the range of tasks eliciting each mode.

Mode	Images	Examples

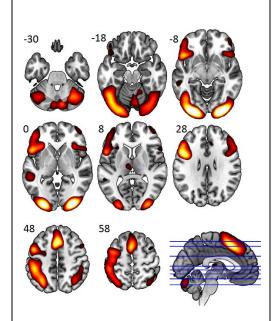
Cognitive processes involved in attending to internal representations

There are three cognitive modes which focus on attending to internal representations.

The first is *Language (LAN)*. The language network is well established (Fedorenko et al., 2024; Lipkin et al., 2022). This mode was previously reported by our group in a number of publications, labelled the Linguistic Processing Network (LPN) (Kusi et al., 2022; Wong et al., 2020), and the Semantic Integration Network (SIN) (Woodward et al., 2015), language network (Besso et al., 2024).

The second is *Maintaining Internal Attention (MAIN)*, which was referred to in previous publications as the *Internal Attention Network* (Sanford et al., 2020b; Sanford & Woodward, 2021) and the *Salience Network* (Larivière et al., 2017). This network shows load-dependence for items in verbal and spatial working memory (Chen et al., 2024; Sanford et al., 2020b; Sanford & Woodward, 2021), and increased activity when imagine the past or future relative to episodic recall (Momeni et al., 2024).

The third is *Re-Evaluation (RE-EV)*. Our group has previously reported RE-EV in several publications, though it has been referred to by other names; namely, the Evaluation Network (Sanford, 2019), the Cognitive Evaluation Network (Lavigne, 2018; Lavigne et al., 2020; Lavigne et al., 2020), and the Integration Network (Lavigne et al., 2015). A review of these task-induced BOLD changes over 6 tasks showing the RE-EV patterns converged on a cognitive mode involving re-evaluating, re-considering, or regulating mental states (Redway et al., 2024). It is more active when disconfirming evidence is presented relative to confirming (Lavigne et al., 2020; Lavigne et al., 2020), and this is decreased in delusions (fixed false beliefs) in schizophrenia (Lavigne et al., 2020), and delusional ideation in healthy people (Lavigne et al., 2020),. It is also more active during incongruent relative to neutral Stroop task performance (Sanford, 2019, Chapter 4.4), increased in conditions involving enhancing or suppress responses to negative stimuli.



Summary

Zeng, E., Shahki, J., Woodward, T. S. (2024). The pattern-based anatomy and cognitive mode associated with the language network in fMRI. PsyArXiv. May 28. osf.io/preprints/psyarxiv/c83d7. DOI:10.31234/osf.io/c83d7.

Component 2

Besso, L., Larivière, S., Roes, M., Sanford, N., Percival, C., Damascelli, M., Momeni, A., Lavigne, K., Menon, M., Aleman, A., Ćurčić-Blake, B. & Woodward, T. S. (2024) Hypoactivation of a Linguistic Processing Brain Network During Auditory Imagery Contributes to Hallucinations in Schizophrenia. Psychiatry Research: Neuroimaging.

https://doi.org/10.1016/j.pscychresns.2024.111824

Component 2

Roes, M.M., Chinchani, A.M., &Woodward, T.S. (2023). Reduced functional connectivity in brain networks underlying paired associates memory encoding in schizophrenia. *Biological Psychiatry: Cognitive Neuroscience and Neuroimaging*, 8(1), 61-70. https://doi.org/10.1016/j.bpsc.2021.07.003

Component 2

Kusi, M., Wong, S.T.S., Percival, C.M., Zurrin, R., Roes, M.M., Woodward, T.S., & Goghari, V.M. (2022). Altered activity in functional brain networks involved in lexical decision making in bipolar disorder: an fMRI case-control study. *Journal of Affective Disorders*, 317, 59-71. https://doi.org/10.1016/j.jad.2022.08.040

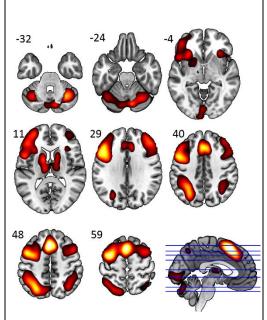
Component 3

Wong, S.T.S., Goghari, V.M., Sanford, N., Lim, R., Clark, C., Metzak, P.D., Rossell, S.L., Menon, M., & Woodward, T.S. (2020). Functional brain networks involved in lexical decision. *Brain and Cognition*, 138, Article 103631.

https://doi.org/10.1016/j.bandc.2019.103631

Component 3

Goghari, V.M., Sanford, N., Spilka, M.J. & Woodward, T.S. (2017). Task-related functional connectivity analysis of emotion discrimination in a family study of schizophrenia. *Schizophrenia Bulletin*, *43*(6), 1348–1362. https://doi.org/10.1093/schbul/sbx004



Sanford, N., & Woodward, T.S. (2021). Functional delineation of prefrontal networks underlying working memory in schizophrenia: a cross-data-set examination. *Journal of Cognitive Neuroscience*, 33(9), 1880-1908. https://doi.org/10.1162/jocn_a_01726

Component 3- Multi-Experiment

Sanford, N., Whitman, J.C., & Woodward, T.S. (2020). Task-merging for finer separation of functional brain networks in working memory. *Cortex*, *125*, 246-271. https://doi.org/10.1016/j.cortex.2019.12.014 Component 2- Chapter 5

Sanford, N.A. (2019). Functional brain networks underlying working memory performance in schizophrenia: a multi-experiment approach [Doctoral dissertation, University of British Columbia]. University of British Columbia Library.

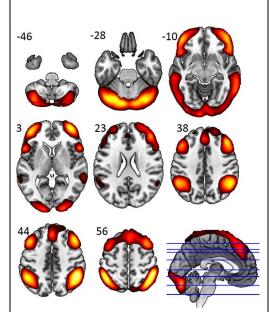
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Component 2

Larivière, S., Lavigne, K.M., Woodward, T.S., Gerretsen, P., Graff-Guerrero, A., & Menon, M. (2017). Altered functional connectivity in brain networks underlying self-referential processing in delusions of reference in schizophrenia. *Psychiatry Research: Neuroimaging*, 263, 32–43. https://doi.org/10.1016/j.pscychresns.2017.03.005

Component 3

Metzak, P.D., Riley, J., Wang, L., Whitman, J.C., Ngan, E.T.C. & Woodward, T.S. (2012). Decreased efficiency of task-positive and task-negative networks during working memory in schizophrenia. *Schizophrenia Bulletin*, *38*(4), 803-813. https://doi.org/10.1093/schbul/sbq154



Summary

Redway, S., Arreaza, L., Shahki, J., Zeng, E., & Woodward, T. (2024). The Pattern-Based Anatomy and Cognitive Mode associated with the Re-Evaluation (RE-EV) Network in fMRI. PsyArXiv. June 27. https://doi.org/10.31234/osf.io/y7pv2

Component 3- Chapter 4 Analysis 3 TSI

Sanford, N. A. (2019). Functional brain networks underlying working memory performance in schizophrenia: a multi-experiment approach [Doctoral dissertation, University of British Columbia]. University of British Columbia Library.

https://open.library.ubc.ca/collections/ubctheses/24/items/1.0387449

Component 3- Study 2

Component 3- Study 3

Lavigne, K. M. (2018). *Cognitive biases and functional brain networks underlying delusions in schizophrenia* [Doctoral dissertation, University of British Columbia]. University of British Columbia Library.

 $\underline{https://open.library.ubc.ca/collections/ubctheses/24/items/1.0364055}$

Component 1

Lavigne, K.M., Metzak, P.D., & Woodward, T.S. (2015). Functional brain networks underlying detection and integration of disconfirmatory evidence. *NeuroImage*, *112*, 138-151. https://doi.org/10.1016/j.neuroimage.2015.02.043

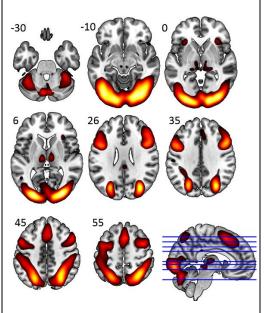
Cognitive processes involved in attending to visually presented stimuli.

There cognitive modes primarily involved in attending to and processing visual representations.

The first is *Initiation (INIT)*, which has been referred to previously as the *Energizing Network* (Sanford & Woodward, 2021), *Visual Attention Network* (Sanford et al., 2020a, 2020b), *Visual Network*, and *Encoding/Probe* (Woodward et al., 2013). This network involves restarting cognitive processing after a break of a few seconds after a set of operations, and peaks very early in the trial (Sanford et al., 2020a, 2020b).

The second is the *Multiple Demand (MD)*, which has been published previously by our group with different nomenclature as the *External Attention Network* (Sanford et al., 2020b), *Visual Attention Network* (Fouladirad et al., 2022; Lavigne et al., 2020), and *Salience Network* (Lavigne et al., 2020). This network is activated when maintaining attention to rapidly presented stimuli (Lavigne, 2018; Lavigne et al., 2020; Whitman et al., 2013), and shows increased activity under conditions of more difficult decision making (Fouladirad et al., 2022).

The third is *Focus on Visual Features* (*FoVF*), which has been referred to previously as the *Occipital Network* (Sanford et al., 2020b) and *Undershoot* (Woodward et al., 2013). This network is activated when details of a scene are important as in spatial working memory, but suppressed when it is better to ignore them, for example, when they could impede performance in the Stroop task (Sanford et al., 2020b).



Besso, L., Larivière, S., Roes, M., Sanford, N., Percival, C., Damascelli, M., Momeni, A., Lavigne, K., Menon, M., Aleman, A., Ćurčić-Blake, B. & Woodward, T. S. (2024) Hypoactivation of a Linguistic Processing Brain Network During Auditory Imagery Contributes to Hallucinations in Schizophrenia. Psychiatry Research: Neuroimaging.

Component 3

Zurrin, R., Wong, S.T.S., Roes, M.M., Percival, C.M., Chinchani, A., Arreaza, L., Kusi, M., Momeni, A., Rasheed, M., Mo, Z., Goghari, V.M., & Woodward, T.S. (2024). Functional brain networks involved in the Raven's Standard Progressive Matrices task and their relation to theories of fluid intelligence. *Intelligence*, *103*, Article 101807. https://doi.org/10.1016/j.intell.2024.101807

Component 1

Component 4

Fouladirad, S., Chen, L.V., Roes, M., Chinchani, A., Percival, C., Khangura, J., Zahid, H., Moscovitz, A., Arreaza, L., Wun, C., Sanford, N., Balzan, R., Moritz, S., Menon, M., & Woodward, T.S. (2022). Functional brain networks underlying probabilistic reasoning and delusions in schizophrenia. *Psychiatry Research: Neuroimaging*, 323, Article 111472.

https://doi.org/10.1016/j.pscychresns.2022.111472

Component 3

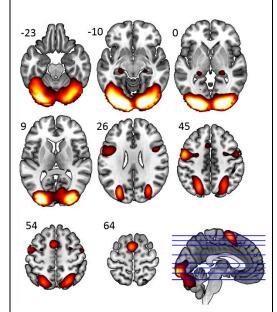
Lavigne, K.M., Menon, M., Moritz, S., & Woodward, T.S. (2020). Functional brain networks underlying evidence integration and delusional ideation. *Schizophrenia Research*, *216*, 302-309. https://doi.org/10.1016/j.schres.2019.11.038

Component 5

Lavigne, K.M., Metzak, P.D., & Woodward, T.S. (2015). Functional brain networks underlying detection and integration of disconfirmatory evidence. *NeuroImage*, *112*, 138-151. https://doi.org/10.1016/j.neuroimage.2015.02.043

Component 1

Woodward, T.S., Tipper, C.M., Leung, A., Lavigne, K.M., Sanford, N., Metzak, P.D. (2015). Reduced functional connectivity during controlled semantic integration in schizophrenia: A multivariate approach. *Human Brain Mapping*, *36*(8), 2948-2964. https://doi.org/10.1002/hbm.22820



Sanford, N., & Woodward, T.S. (2021). Functional delineation of prefrontal networks underlying working memory in schizophrenia: a cross-data-set examination. Journal of Cognitive Neuroscience, 33(9), 1880-1908. https://doi.org/10.1162/jocn a 01726

Component 2- Single-Experiment

Component 2- Multi-Experiment

Sanford, N., Whitman, J.C., & Woodward, T.S. (2020). Task-Merging for finer separation of functional brain networks in working memory. Cortex, 125, 246-271.

https://doi.org/10.1016/j.cortex.2019.12.014

Component 2

Lavigne, K.M., Metzak, P.D., & Woodward, T.S. (2015). Functional brain networks underlying detection and integration of disconfirmatory evidence. NeuroImage, 112, 138-151. https://doi.org/10.1016/j.neuroimage.2015.02.043

Component 1

Lavigne, K.M., Rapin, L.A., Metzak, P.D., Whitman, J.C., Jung, K., Dohen, M., Loevenbruck, H., & Woodward, T.S. (2015). Leftdominant temporal-frontal hypercoupling in schizophrenia patients with hallucinations during speech perception. Schizophrenia Bulletin, 41(1), 259-267. https://doi.org/10.1093/schbul/sbu004

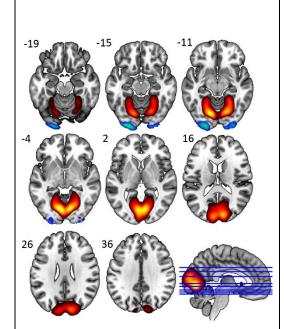
Component 1

Woodward, T.S., Feredoes, E., Metzak, P.D., Takane, Y., & Manoach, D.S. (2013). Epoch-specific functional networks involved in working memory. NeuroImage, 65, 529-539. https://doi.org/10.1016/j.neuroimage.2012.09.070

Component 2

Metzak, P.D., Riley, J., Wang, L., Whitman, J.C., Ngan, E.T.C. & Woodward, T.S. (2012). Decreased efficiency of task-positive and task-negative networks during working memory in schizophrenia. Schizophrenia Bulletin, 38(4), 803-813.

https://doi.org/10.1093/schbul/sbq154



Component 6- Multi-Experiment

Sanford, N., Whitman, J.C., & Woodward, T.S. (2020). Task-Merging for finer separation of functional brain networks in working memory. *Cortex*, 125, 246-271.

https://doi.org/10.1016/j.cortex.2019.12.014

Component 1- Chapter 4 Analysis 3 TSI

Component 7- Chapter 5

Sanford, N. A. (2019). Functional brain networks underlying working memory performance in schizophrenia: a multi-experiment approach [Doctoral dissertation, University of British Columbia]. University of British Columbia Library.

https://open.library.ubc.ca/collections/ubctheses/24/items/1.0387449

Component 3

Lavigne, K.M., Metzak, P.D., & Woodward, T.S. (2015). Functional brain networks underlying detection and integration of disconfirmatory evidence. *NeuroImage*, *112*, 138-151. https://doi.org/10.1016/j.neuroimage.2015.02.043

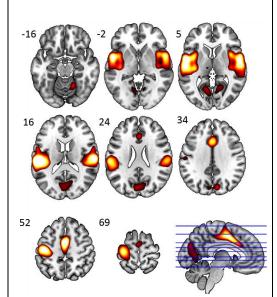
Component 4

Woodward, T.S., Feredoes, E., Metzak, P.D., Takane, Y., & Manoach, D.S. (2013). Epoch-specific functional networks involved in working memory. *NeuroImage*, *65*, 529-539. https://doi.org/10.1016/j.neuroimage.2012.09.070

Cognitive processes involved in attending to auditorily presented stimuli.

There are two networks which measure cognitive processes involved in attending to auditory stimuli in different ways. The first is *Auditory Perception* (AUD), which has been referred to previously as the *Auditory Network* (Sanford et al., 2020a, 2020b). This network is active when listening to speech, and is hyperactive in hallucinations in schizophrenia (Lavigne & Woodward, 2018).

The second is the *Auditory Attention for Response* (AAR) network, which has been referred to previous as the *Auditory-Motor Attention Network* (Sanford & Woodward, 2021), *Sensorimotor Network* (Sanford et al., 2020b), *Auditory-Motor Network* (Lavigne & Woodward, 2018), and (*Auditory-Motor) Response Activation Network* (Lavigne et al., 2016). This network is activated when auditory stimuli is being monitored when a response is required, but deactivated during intensive monitoring of visual details (Lavigne et al., 2016; Lavigne & Woodward, 2018; Sanford et al., 2020b; Sanford & Woodward, 2021), analogous to the familiar situation where someone is visually monitoring their phone, they are less likely to hear what you're saying to them.



Fouladirad, S., Chen, L.V., Roes, M., Chinchani, A., Percival, C., Khangura, J., Zahid, H., Moscovitz, A., Arreaza, L., Wun, C., Sanford, N., Balzan, R., Moritz, S., Menon, M., & Woodward, T.S. (2022). Functional brain networks underlying probabilistic reasoning and delusions in schizophrenia. *Psychiatry Research: Neuroimaging*, 323, Article 111472. https://doi.org/10.1016/j.pscychresns.2022.111472

Component 3

Sanford, N., & Woodward, T.S. (2021). Functional delineation of prefrontal networks underlying working memory in schizophrenia: a cross-data-set examination. *Journal of Cognitive Neuroscience*, *33*(9), 1880-1908. https://doi.org/10.1162/jocn_a_01726

Component 3- Chapter 5

Sanford, N. A. (2019). Functional brain networks underlying working memory performance in schizophrenia: a multi-experiment approach [Doctoral dissertation, University of British Columbia]. University of British Columbia Library.

https://open.library.ubc.ca/collections/ubctheses/24/items/1.0387449

Component 1

Lavigne, K.M., & Woodward, T.S. (2018). Hallucination- and speech-specific h Auditory Attention for Response ypercoupling in frontotemporal auditory and language networks in schizophrenia using combined task-based fMRI data: An fBIRN study. *Human Brain Mapping*, 39(4), 1582–1595.

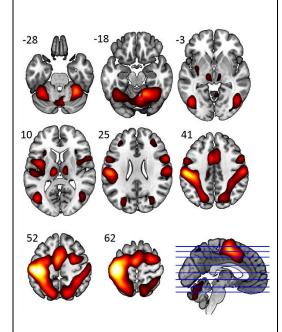
Component 2

https://doi.org/10.1002/hbm.23934

Lavigne, K.M., Menon, M., & Woodward, T.S. (2016). Impairment in subcortical suppression in schizophrenia: Evidence from the fBIRN oddball task. *Human Brain Mapping*, *37*(12), 4640-4653. https://doi.org/10.1002/hbm.23334

Sensorimotor Processes.

The *Motor Response* (RESP) network is involved in responding, with a HDR that peaks late in the trial, but it is lateralized for one-handed response (Sanford et al., 2020b), and bilateral for a two-handed response (Goghari et al., 2017). This network has been referred to previously in our published work as the *Responding Network* (Roes et al., 2023), *Sensorimotor (Response) Network* (Gill et al., 2022), *Posterior Cortical Midline Structure Network* (Larivière et al., 2017), *Dorsal Attention Network/Frontoparietal Network* (Woodward et al., 2016), *Dorsal Anterior Cingulate Cortex-Based Network* (Whitman et al., 2013), and *Probe* (Woodward et al., 2013).



Component 3

Besso, L., Larivière, S., Roes, M., Sanford, N., Percival, C., Damascelli, M., Momeni, A., Lavigne, K., Menon, M., Aleman, A., Ćurčić-Blake, B. & Woodward, T. S. (2024) Hypoactivation of a Linguistic Processing Brain Network During Auditory Imagery Contributes to Hallucinations in Schizophrenia. Psychiatry Research: Neuroimaging.

Component 2

Zurrin, R., Wong, S.T.S., Roes, M.M., Percival, C.M., Chinchani, A., Arreaza, L., Kusi, M., Momeni, A., Rasheed, M., Mo, Z., Goghari, V.M., & Woodward, T.S. (2024). Functional brain networks involved in the Raven's Standard Progressive Matrices task and their relation to theories of fluid intelligence. *Intelligence*, 103, Article 101807. https://doi.org/10.1016/j.intell.2024.101807

Component 1

Roes, M.M., Chinchani, A.M., &Woodward, T.S. (2023). Reduced functional connectivity in brain networks underlying paired associates memory encoding in schizophrenia. *Biological Psychiatry: Cognitive Neuroscience and Neuroimaging*, 8(1), 61-70. https://doi.org/10.1016/j.bpsc.2021.07.003

Component 2

Fouladirad, S., Chen, L.V., Roes, M., Chinchani, A., Percival, C., Khangura, J., Zahid, H., Moscovitz, A., Arreaza, L., Wun, C., Sanford, N., Balzan, R., Moritz, S., Menon, M., & Woodward, T.S. (2022). Functional brain networks underlying probabilistic reasoning and delusions in schizophrenia. *Psychiatry Research: Neuroimaging*, 323, Article 111472.

https://doi.org/10.1016/j.pscychresns.2022.111472

Component 2- Melbourne and Utrecht Patient Hallucinations Merged Analysis

Gill, K., Percival, C., Roes, M., Arreaza, L., Chinchani, A., Sanford, N., Sena, W., Mohammadsadeghi, H., Menon, M., Hughes, M., Carruthers, S., Sumner, P., Woods, W., Jardri, R., Sommer, I.E., Rossell, S.L., & Woodward, T.S. (2022). Real-time symptom capture of hallucinations in schizophrenia with fMRI: absence of duration-dependent activity. *Schizophrenia Bulletin Open*, *3*(1), Article sgac050. https://doi.org/10.1093/schizbullopen/sgac050

Component 3

Kusi, M., Wong, S.T.S., Percival, C.M., Zurrin, R., Roes, M.M., Woodward, T.S., & Goghari, V.M. (2022). Altered activity in functional brain networks involved in lexical decision making in bipolar disorder: an fMRI case-control study. *Journal of Affective Disorders*, 317, 59-71. https://doi.org/10.1016/j.jad.2022.08.040

Component 3

Lavigne, K.M., Menon, M., Moritz, S., & Woodward, T.S. (2020). Functional brain networks underlying evidence integration and delusional ideation. *Schizophrenia Research*, *216*, 302-309. https://doi.org/10.1016/j.schres.2019.11.038

Component 1- Single-Experiment

Component 1- Multi-Experiment

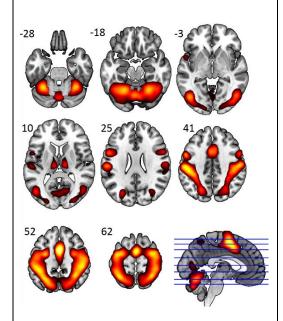
Sanford, N., Whitman, J.C., & Woodward, T.S. (2020). Task-Merging for finer separation of functional brain networks in working memory. *Cortex*, *125*, 246-271. https://doi.org/10.1016/j.cortex.2019.12.014

Component 1

Larivière, S., Lavigne, K.M., Woodward, T.S., Gerretsen, P., Graff-Guerrero, A., & Menon, M. (2017). Altered functional connectivity in brain networks underlying self-referential processing in delusions of reference in schizophrenia. *Psychiatry Research: Neuroimaging*, 263, 32–43. https://doi.org/10.1016/j.pscychresns.2017.03.005

Component 4

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Component 1- Chapter 4 Analysis 2 SCAP

Component 2- Chapter 4 Analysis 3 TSI

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Component 1

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Component 1

Woodward, T.S., Leong, K., Sanford, N., Tipper, C.M., & Lavigne, K.M. (2016). Altered balance of functional brain networks in schizophrenia. *Psychiatry Research: Neuroimaging*, 248, 94-104. https://doi.org/10.1016/j.pscychresns.2016.01.003

Component 1

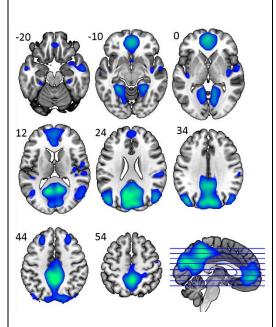
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Component 2

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Component 2

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Component 1

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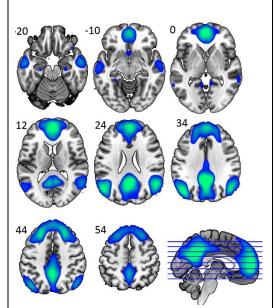
Component 3

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Component 1

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Component 3- Single-Experiment

Component 4- Multi-Experiment

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Component 1

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Component 3- Chapter 4 Analysis 1 WM

Component 2- Chapter 4 Analysis 2 SCAP

Component 1- Chapter 5

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Component 2- Study 2

Component 2- Study 3

Lavigne, K. M. (2018). *Cognitive biases and functional brain networks underlying delusions in schizophrenia* [Doctoral dissertation, University of British Columbia]. University of British Columbia Library.

https://open.library.ubc.ca/collections/ubctheses/24/items/1.0364055

Component 2

Goghari, V.M., Sanford, N., Spilka, M.J. & Woodward, T.S. (2017). Task-related functional connectivity analysis of emotion discrimination in a family study of schizophrenia. *Schizophrenia Bulletin*, *43*(6), 1348–1362. https://doi.org/10.1093/schbul/sbx004

Component 2

Woodward, T.S., Leong, K., Sanford, N., Tipper, C.M., & Lavigne, K.M. (2016). Altered balance of functional brain networks in schizophrenia. *Psychiatry Research: Neuroimaging*, 248, 94-104. https://doi.org/10.1016/j.pscychresns.2016.01.003

Component 4

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Component 2

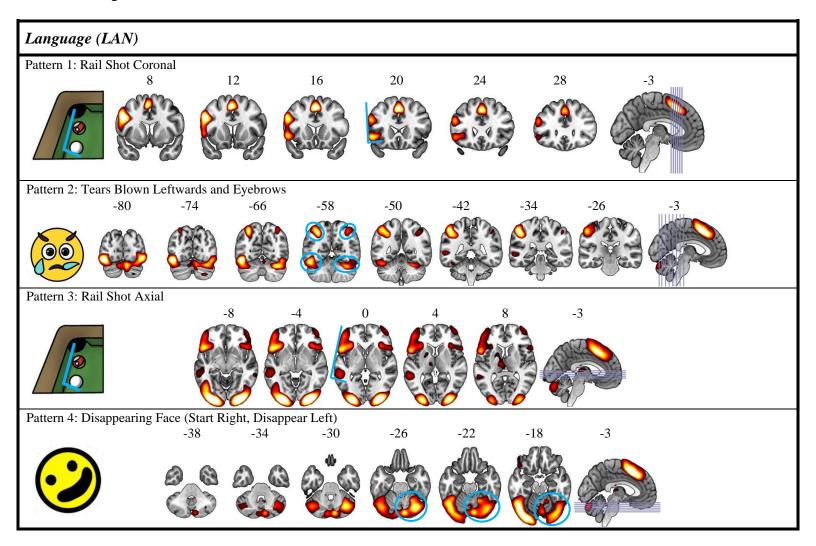
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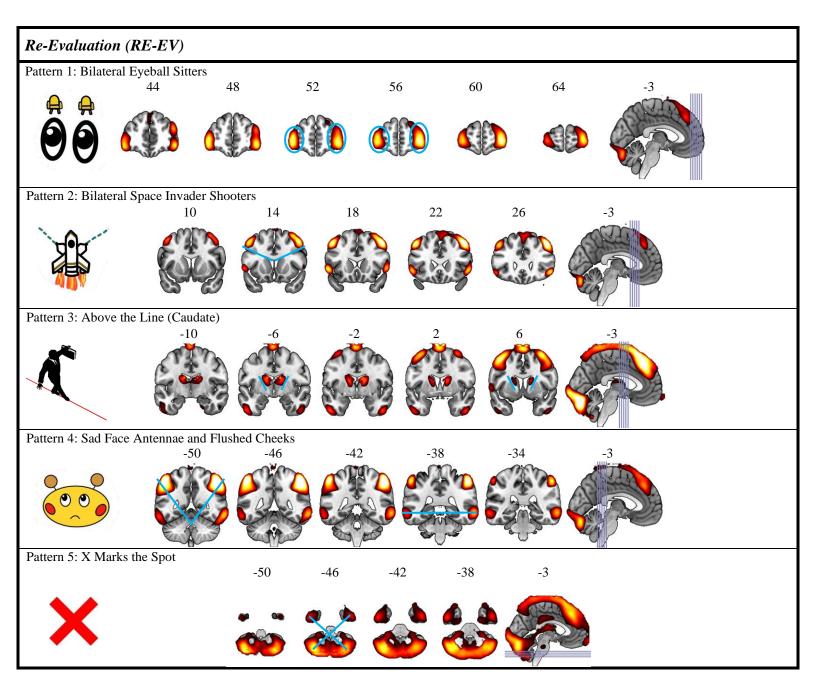
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Characteristic Anatomical Patterns of the Proposed Prototypical Cognitive Modes

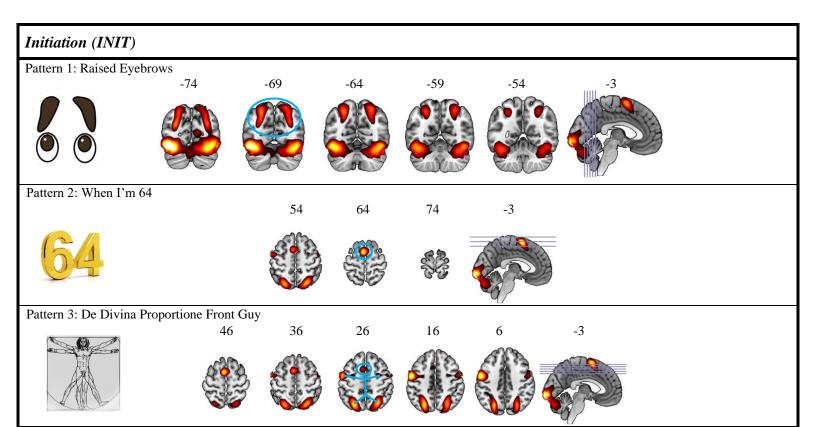
Each of the twelve cognitive modes described above were identified through replicable and characteristic anatomical activation patterns. The characteristic activation patterns for each cognitive mode are detailed below.



Maintaining Internal Attention (MAIN) Pattern 1: Left-Lateralized Upper Triangle 64 56 48 44 -3 Pattern 2: Left-Lateralized Lower Triangle 32 40 36 -3 Pattern 3: Right-Sided Crab Claw -48 -40 -32 -24 -3 Pattern 4: Found a Peanut -3 18 14 10

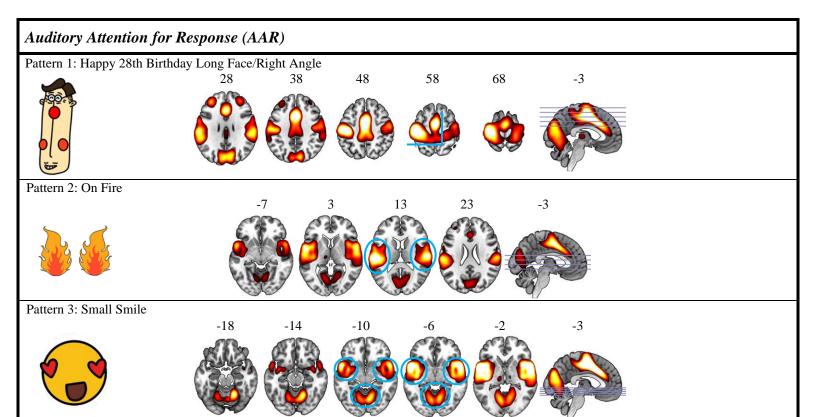


Multiple Demand (MD) Pattern 1: Jumping Jack Flash 10 18 26 34 Pattern 2: Gorilla Nostrils -12 -18 -24 -30 Pattern 3: Flexing Hands 46 36 26 16 -3 Pattern 4: Wipe Your Mouth Bear Triple Jam -3 -34 -30 -26 -22



Pattern 1: Stay Puft -89 -84 -79 -74 -69 -3 Pattern 2: Wishbone -15 -10 -5 0 5 -3

Pattern 1: Headphones -22 -12 -2 8 18 28 -3 Pattern 2: Angry Dragon -27 -22 -17 -12 -7 -3



One-Handed Response (1RESP) Pattern 1: Bat (Left Wing) -10 10 20 Pattern 2: Thalamus Kite Surfer (Left-Lateralized) -16 -21 -26 -11 Pattern 3: Butterfly (Left-Dominant) 72 62 52 42 -3 Pattern 4: Lobster Claw (Right-Dominant) -16 -20 -24 -28 -3

Two-Handed Response (2RESP) Pattern 1: Bat (Bilateral) Pattern 7. Thalamus Kite Surfer (Bilateral) -11 -16 -21 -26 Pattern 3: Butterfly (Bilateral) 72 62 52 42 -3 Pattern 4: Compact Lobster Claw (Bilateral) -20 -24 -28 -3

Default Mode A (DMA) Pattern 1: Snowman Mouth 22 27 32 37 -3 Pattern 2: Muted Medial Temporal Dots -10 Pattern 3: Penguin -86 -76 -66 -56 -46 -36 Pattern 4: Kitten -3 Pattern 5: Laughing Clown -42 -37 -32 -3 Pattern 6: You're In Trouble 10 -20 -10 0 20 -3

Default Mode B (DMB) Pattern 1: Snowman Nose 22 27 32 37 -3 Pattern 2: Prominent Medial Temporal Dots -3 Pattern 3: In Flight -86 -76 -66 -56 -46 -36 Pattern 4: Tripod -3 Pattern 5: Mandibles -37 -32 -3 Pattern 6: Angel Wings -20 -10 -3 10 20

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