

Curriculum Vitae  
**Michael J. Frank**

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**Employment:**

July 2016 – Professor, Cognitive, Linguistic & Psychological Sciences,  
Dept of Psychiatry, Brown Institute for Brain Science, *Brown University*  
July 2011 – June 2016 Associate Professor, Dept of Cognitive, Linguistic & Psychological Sciences,  
Dept of Psychiatry, Brown Institute for Brain Science, *Brown University*  
Jan 2009 – June 2011 Assistant Professor, Dept of Cognitive, Linguistic & Psychological Sciences,  
Dept of Psychiatry, Brown Institute for Brain Science, *Brown University*  
Jan 2006 – Dec 2008 Assistant Professor, Dept of Psychology, Program in Neuroscience, Cognitive  
Science Program, *University of Arizona*

**Degrees:**

Ph.D., Neuroscience & Psychology (joint), University of Colorado at Boulder, 2004  
Thesis: "Dynamic Dopamine Modulation of Striato-Cortical Circuits in Cognition."  
Randall C. O'Reilly advisor.  
M.S., Electrical Engineering (biomedicine), University of Colorado at Boulder, 2000  
B.Sc., Electrical Engineering, Queen's University, Canada, 1997

**Additional Education:**

Postdoctoral Fellow, Department of Psychology & Center for Neuroscience, University of Colorado, 2005  
John Merck Fund Summer Institute on Biology of Developmental Disabilities, Princeton University, 2004  
Pure and Applied Science, Marianopolis College, Montreal, Canada, 1996

**Research Interests:**

Computational modeling of neural mechanisms underlying reinforcement learning, decision making, working memory and inhibitory control. I develop neural network and mathematical models of interactions between basal ganglia, frontal cortex, and hippocampus, and modulation of these brain areas by dopamine and other neuromodulators. I test theoretical predictions of the models using various neuropsychological, electrophysiological, pharmacological, neuroimaging and genetic techniques.

**Awards and Honors:**

- Kavli Science Fellow, 2016
- Radboud Excellence Professorship, 2015, for "eminent researchers who have had a significant impact in their discipline and beyond" Radboud University Nijmegen, The Netherlands
- Fellow, Association for Psychological Science, 2012
- Cognitive Neuroscience Society Young Investigator Award, 2011
- Janet T Spence Award for Transformative Early Career Contributions, APS, 2010
- Neural Networks journal award for most cited article between 2006-2010
- D.G. Marquis Behavioral Neuroscience Award, best paper in Behavioral Neuroscience, 2006
- Dozier Award for outstanding scholarly record, University of Colorado, 2004
- University of Colorado Graduate Fellowship
- Natural Sciences & Engineering Research Council graduate scholarship (Canada)
- Dean's Award, Queen's University, 1996
- Dean's Scholar, Queen's University, 1994/95/96/97

**Grants:****Current**

*Clinical and computational studies of dopamine function in Schizophrenia*, NIMH R01 MH080066-01, 06/07/13 – 05/31/18, co-investigator with Jim Gold (PI, Maryland Psychiatric Research Center), \$531,724 direct costs (Brown subcontract)

*How Prefrontal Cortex Augments Reinforcement Learning*

2/1/2015- 1/31/18

NSF Proposal # 1460604

Role:PI \$372,056 direct costs

*Goal Directed Behavior and Uncertainty in Obsessive Compulsive Disorder*

7/1/2016 – 6/30/2017

Brown Institute for Brain Science Norman Prince Neuroscience Institute, New Frontiers Award

Role: co-PI, \$39,741 direct costs

*The Cost of Cognitive Doping: From dopamine to cognitive control via dynamic neural coding*

9/1/16 – 8/31/17

NWO / Radboud University Cools (PI)

\$61,924 direct costs current year

Role: co-investigator

*Brain and Behavior Mechanisms of Irritability and Cognitive Flexibility in Children*

1/12-17 – 11/30/21

NIMH R01MH111542

\$133,716 direct costs

Role: co-investigator, Daniel Dickstein (PI)

*Adaptive DBS in Non-Motor Neuropsychiatric Disorders: Regulating Limbic Circuit Imbalance*

9/1/2016 – 8/31/2021

NINDS UH3NS100549

Role: co-investigator, Wayne Goodman (PI, Baylor College of Medicine)

**Completed**

*Integrated Computational Psychiatry: Behavioral, Neurophysiological and Optogenetic Testing of Antipsychotic-Driven Aberrant Learning in the Cortico-Striatal D2 Pathway*

Brown Institute for Brain Science Innovation Award

7/1/14-6/30/15 Co-PI, \$100,000

*Electropysiological and computational studies on action monitoring.*

National Science Foundation

9/1/11 – 8/31/15 Frank (PI), \$424,695 direct costs

*The influence of stimulant therapy and co-morbidity on decisions in ADHD*

Norwegian Research Council

01/07/12 – 06/30/14, Tor Endestad (PI)

*BL-OG: A Novel Minimally-Invasive and Homeostatic Method for Selective Regulation of Neural Dynamics in the Subthalamic Nucleus*

Michael J Fox Foundation

9/1/13-8/31/14 Co-PI \$75,000

*Clinical and computational studies of dopamine function in Schizophrenia*, NIMH R01 MH080066-01, 01/01/08 – 12/31/12, co-investigator with Jim Gold (PI), \$409,521 direct costs (subcontract)

*Orbitofrontal and striatal mechanisms in stress and addiction*, NIDA R21 DA022630, 9/1/06-12/31/10, co-PI with Lesley Fellows (PI), \$210,000 direct costs (subcontract)

*Neurocognitive Computations in Parkinson's Disease*

Michael J Fox Foundation for Parkinson's Research

1/1/09 – 12/31/11 Frank (PI), \$366,848 direct costs

### **Journal Articles:**

Collins, A.G.E., Albrecht, M.A., Waltz, J.A., Gold, J.M., & Frank, M.J. (in press). Interactions between working memory, reinforcement learning and effort in value-based choice: a new paradigm and selective deficits in schizophrenia. *Biological Psychiatry*

Kasanova, Z., Ceccarini, J., Frank, M.J., van Amelsvoort, T., Booij, J., Heinzl, A., Mottaghy, F., & Myin-Germeys, I. (2017). Striatal Dopaminergic Modulation of Reinforcement Learning Predicts Reward-Oriented Behavior in Daily Life. *Biological Psychology* 127, 1-9.

Swart, J., Cook, J.L., Geurts, D.E.M., Frank, M.J., Cools, R. & den Ouden, H.E.M. (2017). Catecholaminergic challenge uncovers distinct Pavlovian and instrumental mechanisms of motivated (in)action. *eLife* 6:e22169

Collins, A.G.E., Ciullo, B., Frank, M.J. & Badre, D. (2017). Working memory load strengthens reward prediction errors. *Journal of Neuroscience* 37, 4332-4342.

Pedersen, M.L., Frank, M.J. & Biele, G. (in press). The drift diffusion model as the choice rule in reinforcement learning. *Psychonomic Bulletin & Review*.

Schutte, I., Slagter, H., Collins, A.G.E., Frank, M.J. & Kenemans, J.L. (2017). Stimulus discriminability may bias value-based probabilistic learning. *PLoS ONE* 12(5): e0176205

Voon, V., Napier, C., Frank, M.J., Sgambato-Faure, V., Grace, A.A., Rodriguez-Oroz, M., Obeso, J., Bezard, E. & Fernagut, P.O. (2017). Impulse control disorders and dyskinesias in Parkinson's disease: an update. *The Lancet Neurology* 16: 238-250

Werchan, D., Collins, A.G.E., Frank, M.J. & Amso, D. (2016). Role of prefrontal cortex in learning and generalizing hierarchical rules in 8-month-old infants. *Journal of Neuroscience* 36, 10314-10322

- Maia, T.V. & Frank, M.J. (2017). An integrative perspective on the role of dopamine in schizophrenia. *Biological Psychiatry* 81(1):52-66
- Dowd, E.C., Frank, M.J., Collins, A.G.E., Gold, J.M. & Barch, D.M. (2016). Probabilistic reinforcement learning in schizophrenia: Relationships to anhedonia and avolition. *Biological Psychiatry: Cognitive Neuroscience and Neuroimaging* 1(5):460-473
- Moustafa, A.A., Chakravarthy, S., Phillips, J. Gupta, A., Keri S, Polner, B., Frank, M. J. & Jahanshahi, M. (2016). Motor symptoms in Parkinson's disease: A unified framework. *Neuroscience & Biobehavioral Reviews* 68:727-40.
- Albrecht, M.A., Waltz, J.A., Frank, M.J. & Gold, J.M. (2016). Probability and magnitude evaluation in schizophrenia. *Schizophrenia Research: Cognition* 5, 41-46.
- Nassar, M.R. & Frank, M.J. (2016). Taming the beast: extracting generalizable knowledge from computational models of cognition. *Current Opinion in Behavioral Sciences* 11, 49-54.
- Collins, A.G.E. & Frank, M.J. (2016). Neural signature of hierarchically structured expectations predicts clustering and transfer of rule sets in reinforcement learning. *Cognition* 152, 160-169
- Wiecki, T.V., Antoniaes, C.A., Stevenson, A. Kennard, C., Borowsky, B., Owen, G., Leavitt, B., Roos, R., Durr, A., Tabrizi, S.J. & Frank, M.J.\* (2016). A computational cognitive biomarker for early-stage Huntington's disease. *PLoS ONE* 11:e0148409.
- Huys, Q., Maia, T.V., & Frank, M.J. (2016). Computational psychiatry as a bridge between neuroscience and clinical applications. *Nature Neuroscience* 19, 404-413.
- Collins, A.G.E. & Frank, M.J. (2016). Motor demands constrain cognitive rule structures. *PLoS Computational Biology* 12: e1004785.
- Albrecht, M.A., Waltz, J.A., Cavanagh, J.F., Frank, M.J. & Gold, J.M. (2016). Reduction of Pavlovian bias in schizophrenia: Enhanced effects in clozapine-administered patients. *PLOS ONE* 11:e0152781
- Doll, B.B., Bath, K.G., Daw, N.D\* & Frank, M.J.\* (2016). Variability in dopamine genes dissociates model-based and model-free reinforcement learning. *Journal of Neuroscience* 36,1211-1222. \* equal contribution
- Franklin, N.T. & Frank, M.J. (2015). A cholinergic feedback circuit to regulate striatal population uncertainty and optimize reinforcement learning. *eLife* 4:e12029.

Badre, D., Frank, M.J., & Moore, C.I. (2015). Interactionist Neuroscience. *Neuron*, 88, 855-860.

Kayser, A.S., Op de Macks, Z., Dahl, R. & Frank, M.J. (2016). A neural correlate of exploratory behavior at the onset of adolescence. *Journal of Cognitive Neuroscience* 28, 199-209.

Stephan, K.E., Bach, D.R., Fletcher, P.C., Flint, J., Frank, M.J., Friston, K.J., Heinz, A., Huys, Q.M., Owen, M.J., Binder, E.B., Dayan, P., Johnstone, E., Meyer-Lindenberg, A., Montague, P.R., Schnyder, U., Wang, X.J. & Breakspear, M. (2016). Charting the landscape of priority problems in Psychiatry - Part I: Nosology and diagnosis. *The Lancet Psychiatry* 3, 77-83

Stephan, K.E., Binder, E.B., Breakspear, M., Dayan, P., Johnstone, E., Meyer-Lindenberg, A., Schnyder, U., Wang, X.J., Bach, D.R., Fletcher, P.C., Flint, J., Frank, M.J., Heinz, A., Huys, Q.M., Montague, P.R., Owen, M.J., & Friston, K.J. (2016). Charting the landscape of priority problems in Psychiatry - Part II: Pathogenesis and aetiology. *The Lancet Psychiatry* 3, 84-90

Moustafa, A.A., Chakravarthy, S., Phillips, J., Crouse, J., Gupta, A., Frank, M. J., Hall, J. M., Jahanshahi, M. (2016). Interrelations between cognitive dysfunction and motor symptoms of Parkinson's disease: Behavioral and neural studies, *Reviews in the Neurosciences* 27(5):535-48

Solomon, M., Ragland, J.D., Niendam, T.A., Lesh, T.A., Beck, J.S., Matter, J.C., Frank, M.J., Carter, C.S. (2015). Atypical learning in autism spectrum disorders: An fMRI study of transitive inference. *Journal of the American Academy of Child and Adolescent Psychiatry* 54: 947-955.

Morris, L., Baek, K., Kundu, P., Harrison, N., Frank, M.J., & Voon, V. (2016). Biases in the explore-exploit tradeoff in addictions: the role of avoidance of uncertainty. *Neuropsychopharmacology* 41(4):940-8.

Slagter, H.A., Georgopoulou, K. & Frank, M.J. (2015). Spontaneous eye blink rate predicts learning from negative, but not positive, outcomes. *Neuropsychologia* 71:126-32.

Gold, J.M., Waltz, J.W. & Frank, M.J. (2015). Effort cost computation in schizophrenia: A commentary on the recent literature. *Biological Psychiatry* 78: 747-753.

Frank, M.J., Gagne, C., Nyhus, E., Masters, S., Wiecki, T.V., Cavanagh, J.F. & Badre, D. (2015). fMRI and EEG predictors of dynamic decision parameters during human reinforcement learning. *Journal of Neuroscience*, 35, 485-494

- Cox, S.M.L., Frank, M.J., Larcher, K., Fellows, L.K., Clark, C.A., Leyton, M., Dagher, A (2015). Striatal D1 and D2 signaling differentially predict learning from positive and negative outcomes, *NeuroImage* 109, 95-101
- Frank, M.J. and Badre, D. (2015). How cognitive theory guides neuroscience. *Cognition*, 135, 14-20 (special issue on influences of cognitive science on other domains).
- Wiecki, T.V., Poland, J.S., & Frank, M.J. (2015). Model-based cognitive neuroscience approaches to computational psychiatry: clustering and classification. *Clinical Psychological Science* 3, 378-399.
- Werchan, D., Collins, A.G.E, Frank, M.J. & Amso, D. (2015). Eight-Month-Old Infants Spontaneously Learn and Generalize Hierarchical Rules. *Psychological Science* 26, 805-815
- Cavanagh, J.F., Masters, S.E., Bath, K.G., and Frank, M.J. (2014). Conflict acts as an implicit cost in reinforcement learning. *Nature Communications* 5:5394
- Cockburn, J., Collins, A.G.E. and Frank, M.J. (2014). A reinforcement learning mechanism responsible for the valuation of free choice. *Neuron* 83, 551-557
- Collins, A.G.E., Brown, J., Gold, J.M., Waltz, J.A., Frank, M.J. (2014). Working memory contributions to reinforcement learning impairments in schizophrenia. *Journal of Neuroscience* 34, 13747-56.
- Kayser, A., Mitchell, J., Weinstein, D. & Frank, M. J. (2015). Dopamine, Locus of Control, and the Exploration-Exploitation Tradeoff. *Neuropsychopharmacology* 40, 454-462
- Bell, P., Gilat, M., O'Callaghan, C., Copland, C., Frank, M.J., Lewis, S. & Shine, J. (2015). Dopaminergic basis for impairments in functional connectivity across subdivisions of the striatum in Parkinson's Disease. *Human Brain Mapping*, 36(4):1278-91
- Collins, A.G.E. and Frank, M.J. (2014). Opponent actor learning (OpAL): Modeling interactive effects of striatal dopamine on reinforcement learning and choice incentive. *Psychological Review* 121, 337-366
- Cavanagh, J.F. and Frank, M.J. (2014). Frontal theta as a mechanism for cognitive control. *Trends in Cognitive Sciences* 18, 414-421.
- Solomon, M., Frank, M.J., Ragland, J.D., Smith, A.C., Niendam, T.A., Lesh, T.A., Grayson, D., Beck, J.S., Matter, J.C. & Carter, C.S. (2015). Feedback-driven trial-by-trial learning in autism spectrum disorders. *American Journal of Psychiatry* 172, 173-181.
- Collins, A.G.E., Cavanagh, J.F. and Frank, M.J. (2014). Human EEG uncovers latent

generalizable rule structure during learning. *Journal of Neuroscience* 34, 4677-4685

Chatham, C., Frank, M.J. and Badre, D. (2014). Corticostriatal output gating during selection from working memory. *Neuron* 81, 930-942

Cavanagh, J.F., Wiecki, T.V., Kochar, A., and Frank, M.J. (2014). Eye tracking and pupillometry are indicators of dissociable latent decision processes. *Journal of Experimental Psychology: General* 143, 1476-1488

Cavanagh, J.F., Sanguinetti, J. L., Allen, J.J.B., Sherman, S.J. and Frank, M.J. (2014). The subthalamic nucleus contributes to post-error slowing. *Journal of Cognitive Neuroscience* 26, 2637-3644

Doll, B.B., Waltz, J.A., Cockburn, J., Brown, J.K., Frank, M.J. & Gold, J.M. (2014). Reduced susceptibility to confirmation bias in schizophrenia. *Cognitive, Affective & Behavioral Neuroscience* 14, 715-728

Moustafa, A.A., Krishna, R., Frank, M.J., Eissa, A., Hewedi, D. (2014). Cognitive correlates of psychosis in patients with Parkinson's disease. *Cognitive Neuropsychiatry* 19, 381-398

Narayanan, N.S., Cavanagh, J.F., Frank, M.J. and Laubach, M. (2013). Common medial frontal mechanisms of adaptive control in humans and rodents. *Nature Neuroscience*, 16, 1888-95

Guitart-Masip, M., Economides, M., Huys, Q., Frank, M.J., Chowdhury, R., Duzel, E., Dayan, P., and Dolan, R. (2014). Differential, but not opponent, effects of L-DOPA and citalopram on action learning with reward and punishment. *Psychopharmacology* 231, 955-966

Wiecki TV, Sofer I and Frank MJ (2013). HDDM: Hierarchical Bayesian estimation of the Drift-Diffusion Model in Python. *Frontiers of Neuroinformatics* 7:14

Collins, A.G.E and Frank, M.J. (2013). Cognitive control over learning: Creating, clustering and generalizing task-set structure. *Psychological Review*, 120, 190-229.

Wiecki, T.V. and Frank, M.J. (2013). A computational model of inhibitory control in frontal cortex and basal ganglia. *Psychological Review*, 120, 329-355.

Cavanagh, J.F., Eisenberg, I., Guitart-Masip, M., Huys, Q., and Frank, M.J. (2013). Frontal theta overrides Pavlovian learning biases. *Journal of Neuroscience*, 33, 8541-8548.

Gold, J.M., Strauss, G.P., Waltz, J.M., Robinson, B.M., Brown, J.K., and Frank, M.J. (2013).

Negative symptoms in schizophrenia are associated with abnormal effort-cost computations. *Biological Psychiatry*, 74, 130-136

Gold, B., Frank, M.J., Bogert, B. and Brattico, E. (2013). Pleasurable music affects reinforcement learning according to the listener. *Frontiers in Auditory Cognitive Neuroscience* 4, 1-19.

Shine, J., Matar, E., Ward, P., Frank, M.J., Moustafa, A., Pearson, M., Naismith, S. and Lewis, S. (2013). Freezing of gait in Parkinson's disease is associated with functional decoupling between the Cognitive Control Network and the basal ganglia. *Brain* 136, 3671-3681.

Shine, J., Moustafa, A. A., Matar, E., Frank, M.J., and Lewis, S. (2013). The role of frontostriatal impairment in freezing of gait in Parkinson's disease. *Frontiers in Systems Neuroscience* 7:61, 1-7

Beeler, J. A\*, Frank, M.J\*, McDaid, J\*, Alexander, E., Turkson, S., Bernandez, M.S., McGehee, D.S., & Zhuang, X. (2012). A role for dopamine-mediated learning in the pathophysiology and treatment of Parkinson's disease. *Cell Reports* 2, 1747-1761.  
\*Joint first author

Berghorst, L. H., Bogdan, R., Frank, M. J. & Pizzagalli, D. A. (2013). Acute stress selectively reduces reward sensitivity. *Frontiers in Neuroscience*, 7, 1-15

Brown, J., Waltz, J.A., Strauss, G.P., McMahon, R.P., Frank, M.J. & Gold, J.M. (2013). Hypothetical decision making in schizophrenia: The role of expected value computation and "irrational" biases". *Psychiatry Research* 209, 142-149

Cavanagh, J.F. and Frank, M.J. (2013). Stop! Stay tuned for more information. Commentary on Alegre et al. *Experimental Neurology* 247, 289-91.

Jahfari, S., Verbruggen, F., Frank, M.J, Waldorp, L., Colzato, L., Ridderinkhof, K.R., and Forstmann, B. (2012). How preparation changes the need for top-down control of the basal ganglia when inhibiting premature actions. *Journal of Neuroscience*, 32, 10870-8.

Collins, A.G.E. and Frank, M.J. (2012). How much of reinforcement learning is working memory, not reinforcement learning? A behavioral, computational, and neurogenetic analysis. *European Journal of Neuroscience* 35, 1024-1035.

Cavanagh, J.F., Figueroa, C. M., Cohen, M.X., and Frank, M.J. (2012). Frontal theta reflects uncertainty and unexpectedness during exploration and exploitation. *Cerebral Cortex* 22, 2575-86.



- Lighthall, N., Gorlick, M. A., Schoeke, A., Frank, M. J. and Mather, M. (2013). Stress Modulates Reinforcement Learning in Younger and Older Adults. *Psychology & Aging* 28, 35-46
- Whitmer, A., Frank, M.J. and Gotlib, I.H. (2012). Sensitivity to reward and punishment in major depressive disorder: The effect of rumination. *Cognition and Emotion* 26, 1475-85.
- Badre, D., Doll, B.B., Long, N.M. and Frank, M.J. (2012). Rostrolateral prefrontal cortex and individual differences in uncertainty-driven exploration. *Neuron* 73, 595-607.
- Ratcliff, R. and Frank, M.J. (2012). Reinforcement-based decision-making in corticostriatal circuits: Mutual constraints by neurocomputational and diffusion models. *Neural Computation* 24, 1186-1229.
- Frank, M.J. and Badre, D. (2012). Mechanisms of hierarchical reinforcement in corticostriatal circuits I: Computational analysis. *Cerebral Cortex* 22, 509-526.
- Badre, D. and Frank, M.J. (2012). Mechanisms of hierarchical reinforcement learning in corticostriatal circuits II: Evidence from fMRI. *Cerebral Cortex* 22, 527-536.
- Gold, J.M., Waltz, J.A., Matveeva, T.M., Kasanova, Z., Strauss, G.P., Herbener, E.S., Collins, A., & Frank, M.J. (2012). Negative symptoms and the failure to represent the expected reward value of actions: Behavioral and computational modeling evidence. *Archives of General Psychiatry* 69, 129-138.
- Cavanagh J.F., Wiecki, T.V., Cohen, M.X., Figueroa, C., Samanta, J., Sherman, S.J., and Frank, M.J. (2011). Subthalamic stimulation reverses mediofrontal influence over decision threshold. *Nature Neuroscience* 14, 1462-67.
- Cavanagh, J.F., Bismark, A., Frank, M.J. and Allen, J.J.B. (2011). Larger error signals in major depression are associated with better avoidance learning. *Frontiers in Cognition* 2, 1-6.
- Wietzikoski, E.C., Boschen, S.L., Miyoshi, E., Bortolanza, L.M, Frank, M.J., Brandao, M.L., Winn, P., Da Cunha, C. (2012). Roles of D1-like dopamine receptors in the nucleus accumbens and dorsolateral striatum in conditioned avoidance responses. *Psychopharmacology* 219, 159-169.
- Ragland, J.D., Cohen, N.J., Cools, R., Frank, M.J., Hannula, D.E., Ranganath, C. (2012). CNTRICS Imaging Biomarkers Final Task Selection: Long-term Memory and Reinforcement Learning. *Schizophrenia Bulletin* 38, 62-72.

Frank, M.J. (2011). Computational models of motivated action selection in corticostriatal circuits. *Current Opinion in Neurobiology* 21, 381-386.

Doll, B.B., Hutchison, K.E. and Frank, M.J. (2011). Dopaminergic genes predict individual differences in susceptibility to confirmation bias. *Journal of Neuroscience* 31, 6188-6198.

Maia, T.V. and Frank, M.J. (2011). From reinforcement learning models to psychiatric and neurological disorders. *Nature Neuroscience* 14, 154-162.

Strauss, G.P.\*, Frank, M.J.\*, Waltz, J.A., Kasanova, Z., Herbener, E.S., Gold, J.M. (2011). Deficits in positive reinforcement learning and uncertainty-driven exploration are associated with distinct aspects of negative symptoms in schizophrenia. *Biological Psychiatry* 69, 424-31 (\*authors contributed equally to this work).

Cavanagh, J.F., Frank, M.J., & Allen, J.J.B. (2011). Social stress reactivity alters reward and punishment learning. *Social, Cognitive and Affective Neuroscience* 6, 311-320.

Strauss, G.P., Robinson, B.M., Waltz, J.A., Frank, M.J., Kasanova, Z., Herbener, E.S., Gold, J.M. (2011). Patients with schizophrenia demonstrate inconsistent preference judgments for affective stimuli. *Schizophrenia Bulletin* 37, 1295-1304.

Solomon, M., Frank, M.J., Smith, A.C., Ly, S. and Carter, C.S. (2011). Transitive inference in adults with autism spectrum disorders. *Cognitive, Affective and Behavioral Neuroscience* 11, 437-449.

Solomon, M., Smith, A.C., Frank, M.J., Ly, S. and Carter, C.S. (2011). Probabilistic reinforcement learning in adults with autism spectrum disorders. *Autism Research* 4, 109-120.

Kasanova Z, Waltz J.A., Strauss G.P., Frank M.J., Gold J.M. (2011). Optimizing vs. matching: Response strategy in a probabilistic learning task is associated with negative symptoms of schizophrenia. *Schizophrenia Research* 127, 215-222.

Frank, M.J. and Fossella, J.A. (2011). Neurogenetics and pharmacology of learning, motivation and cognition. *Neuropsychopharmacology Reviews* 36, 133-152.

Waltz, J. A., Frank, M.J., Wiecki, T.V. & Gold, J.M. (2011). Altered probabilistic learning and response biases in schizophrenia: Behavioral evidence and neurocomputational modeling. *Neuropsychology* 25, 86-97.

Cavanagh, J.F., Frank, M.J., Klein, T.J., & Allen, J.J.B. (2010). Frontal theta links prediction errors to behavioral adaptation in reinforcement learning. *NeuroImage* 49, 3198-3209.

Wiecki, T.V. and Frank, M.J. (2010). Neurocomputational models of motor and cognitive deficits in Parkinson's disease. *Progress in Brain Research* 183, 275-297.

Cavanagh, J.F., Gruendler, T.O., Frank, M.J., & Allen, J.J.B. (2010). Altered cingulate sub-region activation accounts for task-related dissociation in ERN amplitude as a function of obsessive-compulsive symptoms. *Neuropsychologia* 48:2098-2109.

Robinson, O.J., Frank, M.J., Sahakian, B.J. and Cools, R. (2010). Dissociable responses to punishment in distinct striatal regions during reversal learning. *NeuroImage* 51, 1459-1467.

Samson, R.D., Frank, M.J., and Fellous, J.-M. (2010). Computational models of reinforcement learning: The role of dopamine as a reward signal. *Cognitive Neurodynamics* 4, 91-105.

Chang, L.J., Doll, B.B., van 't Wout, M., Frank, M.J. and Sanfey, A.G. (2010). Seeing is believing: Trustworthiness as a dynamic belief. *Cognitive Psychology* 61, 87-105.

Hazy, T.E., Frank, M.J. and O'Reilly, R.C. (2010). Neural mechanisms of acquired phasic dopamine responses in learning. *Neuroscience & Biobehavioral Reviews* 34, 701-720.

Chase, H.W., Frank, M.J., Albert, M., Bullmore, E.T., Sahakian, B.J. and Robbins, T.W. (2010). Approach and avoidance learning in patients with major depression and healthy controls: Relation to anhedonia. *Psychological Medicine* 40:433-440.

Frank, M.J., Doll, B.B., Oas-Terpstra, J. and Moreno, F. (2009). Prefrontal and striatal dopaminergic genes predict individual differences in exploration and exploitation. *Nature Neuroscience* 12:1062-1068.

Frank, M.J. and Hutchison, K. (2009). Genetic contributions to avoidance-based decisions: Striatal D2 receptor polymorphisms. *Neuroscience* 164:131-140.

Doll, B.B., Jacobs, W.J., Sanfey, A.G. and Frank M.J. (2009). Instructional control of reinforcement learning: A behavioral and neurocomputational investigation. *Brain Research* 1299:74-94

Chatham, C., Frank, M.J. and Munakata, Y. (2009). Pupillometric and behavioral markers of a developmental shift in the temporal dynamics of cognitive control. *Proceedings of the National Academy of Science*, 106, 5529-33

Wiecki, T.V., Riedinger, K., Meyerhofer, A., Schmidt, W.J. and Frank, M.J. (2009). A neurocomputational account of catalepsy sensitization induced by D2-receptor-blockade in rats: Context-dependency, extinction and renewal. *Psychopharmacology*, 204, 265-77

Frank, M.J., Cohen, M.X. and Sanfey, A.G. (2009). Multiple systems in decision making: A neurocomputational perspective. *Current Directions in Psychological Science*, 18, 73-77.

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## Books

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## Commentaries/Editorials/Book Chapters/Conference Proceedings:

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Collins, A.G.E. & Frank, M.J. (2016). Surprise! Dopamine signals mix action, value and error. *News & Views, Nature Neuroscience* 19, 3-5

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Doll, B.B. and Frank, M.J. (2009). The basal ganglia in reward and decision making: Computational models and empirical studies. Chapter in J.-C. Dreher and L. Tremblay, eds, *Handbook of Reward and Decision Making*, Oxford:Academic Press, pp399-425.

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### **Popular Press (non-peer reviewed):**

Frank, M.J. (2007). "Go" and "NoGo" Learning and the Basal Ganglia. *Cerebrum* (<http://www.dana.org/news/cerebrum/detail.aspx?id=10376>)

Frank, M.J. and O'Reilly, R.C. (2005). Cognitive processes in Parkinson's disease: From dopamine to behavior. *Colorado Neurological Institute Review*, Fall 2005, pp. 3-9.

### **Scholarly Presentations:**

#### ***Colloquia (Invited)***

Maryland Psychiatric Research Center, Baltimore MD, 6/28/17

Neuroeconomics Colloquium, New York University, New York NY 4/25/17

Cognitive Science colloquium, Princeton University, Princeton NJ 3/30/17

Bridge Webinar series: McGill U, Johns Hopkins U, Pittsburgh Supercomputing Center, 1/17/17

University of California at San Francisco Neuroscience seminar series, San Francisco CA 3/31/16

Johns Hopkins University Biomedical Engineering seminar series, Baltimore MD 3/28/16

IBM TJ Watson Research Center, Computational Biology seminar, Yorktown NY 1/12/16

Université de Montréal, Neuroscience series, Montreal Quebec Canada, 1/8/16

American University, Special Lectures on Cognitive Neurosciences, Washington DC, 11/13/15

University of Maryland Neuroscience and Cognitive Science series, 10/23/15

Harvard University, Department of Psychology colloquium, Cambridge MA, 10/7/15

University of Western Ontario, Neuroscience speaker series, London ON 9/29/15

Yale University, Behavior, Genetics & Neuroscience seminar series, New Haven CT 9/17/15

Donders Institute for Brain, Cognition and Behaviour, Nijmegen, the Netherlands, 6/18/15

Google DeepMind, London UK, 5/28/15



UCL Wellcome Trust Center for Neuroimaging "Brain Meeting", London UK, 4/17/15  
University of British Columbia, Brain Research Centre, Vancouver, Canada, 1/9/15  
University of Pennsylvania Psychology Dept, Philadelphia PA, 10/27/14  
Washington University in St. Louis: Cognitive, Computational, and Systems Neuroscience  
Invited Lecturer, St Louis, MO 10/6/14  
Carnegie Mellon University, Dept of Psychology Colloquium, Pittsburgh, PA 9/22/14  
Carnegie Mellon University, Cognitive Brown Bag, Pittsburgh, PA 9/22/14  
Columbia University Dept of Pharmacology, New York NY 5/20/14  
UCL, Affective Brain Lab Online Talk Series, London UK, 5/15/14  
Duke University, Duke Institute for Brain Science, Durham NC, 1/31/14  
Harvard University, Maclean Hospital, Boston, MA, 12/17/13  
University of Amsterdam, special seminar, Amsterdam, the Netherlands, 6/14/13  
University of Amsterdam, Brain and Cognition series, Amsterdam, the Netherlands, 6/6/13  
Harvard University, Decision-Making workshop series, Cambridge MA, 11/16/11  
New York University, Neuroeconomics seminar series, New York NY 9/27/11  
National Institute of Neurological Disorders and Stroke (NINDS), Bethesda MD, 8/16/11  
University of Amsterdam, Cognitive Science Center Amsterdam, The Netherlands, 6/16/11  
Columbia University, Center for Theoretical Neuroscience, New York NY 5/27/11  
University of California at Davis, Perspectives in Neuroscience series, Davis CA 5/12/11  
University of Massachusetts at Amherst, Dept of Psychology, Amherst MA 4/6/11  
University of Colorado, Center for Determinants of Executive Function and Dysfunction, Boulder 1/20/11  
University of Pennsylvania, Institute for Research in Cognitive Science, Philadelphia, PA 12/10/10  
New York University Center for Neural Science, Memory in Brain series, New York NY 11/5/10  
CELEST Science of Learning seminar series, Boston University, Boston MA 10/29/10  
Grand rounds, Dept of Neurology, Brown University, Providence RI 5/19/10  
National Institute on Drug Abuse (NIDA) seminar series, Baltimore MD 5/11/10  
UCLA, Center for Neurobehavioral Genetics, Los Angeles CA 5/6/10  
Yale University, Cognitive Science seminar series, New Haven CT 4/6/10  
John B Pierce Laboratory, Yale University School of Medicine, New Haven CT 4/5/10  
University College London, "Brain meeting", London UK 2/5/10  
University of Chicago, Center for Integrative Neuroscience and Neuroengineering, 1/19/10  
Donders Institute for Brain, Cognition & Behaviour, Nijmegen, The Netherlands, 7/29/09  
University of Zurich, Institute for Empirical Economics, Zurich, Switzerland, 6/4/09  
Queen's University, Centre for Neurosciences, Kingston Canada, 4/8/09  
Northwestern University, Dept of Physiology Feinberg School of Medicine, Chicago IL, 3/13/09  
Johns Hopkins University, Dept of Psychological & Brain Sciences, Baltimore Maryland, 2/11/09  
University of Waterloo, Centre for Theoretical Neuroscience, Waterloo, Canada, 12/12/08  
Tamagawa University, Tokyo, Japan, 10/15/08  
University of Colorado, Institute for Cognitive Science, Boulder, CO, 7/30/08  
Max Planck Institute, Neurocognition of Decision Making Group, Berlin Germany, 7/18/08  
Laboratoire de la Neurobiologie de la Cognition, Université de Provence, Marseille, France, 7/15/08  
Gatsby Computational Neuroscience Unit, University College London, London, UK, 6/4/08  
University of Cambridge Behavioral Neuroscience seminar series, Cambridge, UK, 6/3/08  
University of Michigan, Neurons, Brains and Models seminar series, Ann Arbor, MI, 4/10/08  
Max Planck Institute, Cologne, Germany, 3/17/08  
University of California at Davis Medical Center, MIND Institute, Davis CA, 2/28/08  
Arizona Research Laboratories Division of Neurobiology seminar, Tucson AZ, 2/25/08  
Brown University, Brain Sciences Program, Providence RI, 2/21/08  
University of Delaware, Cognition and the Brain series, 10/5/2007.  
Yale University, Swartz Initiative in Theoretical Neurobiology, New Haven, CT, 5/25/07  
UCSD Temporal Dynamics of Learning Center, San Diego, CA, 5/18/07  
Princeton University Neuroscience Institute, Princeton, NJ, 4/26/07  
Mathematics Awareness Month, 'Mathematics and the Brain', U of Arizona, 4/17/07

Workshop on Computational Neuroscience, department of mathematics, Uof Arizona, 2/23/07  
California Institute of Technology, Neuroeconomics seminar series, Pasadena CA 01/25/07  
Ohio State University, dept of Psychology, Columbus OH 11/19/07  
UCLA Dept of Psychology, Los Angeles, CA, 7/26/06  
University of Bonn, Center for Life and Brain, Bonn Germany, 6/6/06  
Institute for Cognitive Science Science of Learning series, University of Colorado, 9/30/05  
Maryland Psychiatric Research Center, University of Maryland Medical School, 9/16/05  
Center for Neuroscience Supergroup, University of Colorado, 9/23/04  
Colorado State University behavioral & cognitive neuroscience brown bag, 9/24/04

***Symposia and Workshops, Invited Talks***

Computational Psychiatry: Opportunities and Challenges, National Institute for Mental Health, Bethesda, MD 6/26-27/17

“Chunking as an optimized strategy for lossy data compression in visual working memory”, Reinforcement Learning and Decision Making Multidisciplinary Conference, Ann Arbor MI 6/13/17

“Deconstructing neural mechanisms of impulsive choice”, Japanese-American Kavli Frontier of Science Symposium, National Academy of Sciences, Irvine CA, 12/2/16

“Gating Mechanisms for Cognitive Control”, chaired symposium at Control Processes workshop, San Diego, CA 11/10/16

“Opponency mechanisms of striatal dopamine on learning and choice”, Gatsby Computational Neuroscience Institute, workshop on dopamine. London UK, 9/30/16

“Cognitive control over learning and action in frontostriatal circuits”, The Brain Conferences, New Insights into Psychiatric Disorders through Computational, Biological and Developmental Approaches. Copenhagen, Denmark, 9/25/16

“Adaptive regulation of decision thresholds by basal ganglia”, Workshop on Sequential Sampling Models of Decision Making, Emmetten Switzerland, 5/10/16

“Frontostriatal interactions at the interface between choice and learning”, The Neuroscience of Decision Making, 38<sup>th</sup> Symposium International du GRSNC, Université de Montréal, 5/3/16

“Computational Psychiatry”, chair invited symposium, Cognitive Neuroscience Society Annual Meeting, New York NY, 4/3/16

“Basal ganglia dynamics during active learning and choice”, Gordon Research Conference on Basal Ganglia, Ventura CA, 03/02/16

“Frontostriatal gating mechanisms in motivated action and cognition”, Workshop on Multiregional Models of Population Coding, Simons Collaboration on the Global Brain, New York NY, 1/19/16

“Probing for informativeness on latent states in value-based decision making”, Computational Psychiatry Course, Zurich, Switzerland, 12/12/15

“The drift diffusion model as a tool for Computational Psychiatry and Neurology”, Computational Psychiatry Course, Zurich, Switzerland, 12/10/15

“Probing for informativeness on latent states in value-based decision making”, International symposium on Prediction and Decision Making, Tokyo Japan, 11/1/15

“Linking levels of analysis in computational models of corticostriatal function”, Methods in Computational Neuroscience summer school, Marine Biology Lab, Woodshole MA, 8/19/15

“Interactive effects of striatal dopamine on reinforcement learning and choice incentive”, Gordon Research Conference on Catecholamines, Sunday River Maine, 8/10/15

Strungmann Forum on Computational Psychiatry, Frankfurt Germany, 6/28/15-7/3/15

“Dopamine, reward prediction error and action selection: Is there a connection?” workshop on Computational Properties of Prefrontal Cortex, Bethesda, MD, 5/15/15

“Probing for information about latent states during reinforcement learning”, Neurocuriosity workshop, INRIA, Bordeaux, France, 11/7/14

“Generalization and transfer during latent structure learning”, Computational Properties of Prefrontal Cortex Workshop, Whistler, BC, Canada, 10/4/14

“Frontal control over striatal learning and choice”, workshop on basal ganglia structure and function, Organization for Computational Neurosciences, Quebec City, Canada, 7/31/14

“Generalization and transfer in structure learning”, workshop on Engineering and Reverse Engineering Reinforcement Learning, Massachusetts Institute of Technology, 7/18/14

“Cognitive control over learning and action in frontostriatal circuits”, Dresden Spring School on Cognitive-Affective Neuroscience, Technical University of Dresden, Dresden Germany, 3/14/14

“Model-based cognitive neuroscience approaches to computational psychiatry: clustering and classification”, Computational and Systems Neuroscience (CoSyne) meeting, Snowbird UT, 3/4/14

“Interactive dynamics of corticostriatal circuits in reinforcement and motor learning”, Sackler Winter Conference on Developmental Psychobiology, Cozumel Mexico, 1/7/14

“EEG and fMRI correlates of dynamic decision parameters during reinforcement learning”, Society for Neuroscience Annual Meeting, San Diego CA, 11/9/13

“Computational models of aberrant learning and decision making in disease states”, Computational Psychiatry conference, Miami, FL, 10/22/13

“Control over learning and action in corticostriatal circuits”, Sackler Summer Institute for Developmental Psychobiology, New York, NY, 7/24/13

“Linking levels of analysis in computational models of corticostriatal function”, The Third International Symposium on "The Biology of Decision Making", Paris France 5/29/13

“Computational models of dopamine in learning and choice incentive”, Dopamine 2013, Alghero Italy, 5/24/13

“Opponent processes for learning and action in frontostriatal circuits”, Meeting on dissection of direct and indirect pathways in Huntington’s Disease, CHDI Foundation, Princeton NJ, 5/9/13

“Cognitive control over learning and action in corticostriatal circuits”, Mechanisms of Motivation, Cognition and Aging Interactions, Washington DC, 5/3/13

“Linking levels of analysis in neurocomputational models of reinforcement learning”, Swartz symposium on Neural Circuits for Decision Making and Reinforcement Learning, Yale University, New Haven CT, 4/12/13

“Prefrontal and striatal contributions to reinforcement learning”, 3rd International Conference on Applications of Neuroimaging to Alcoholism, Yale University, New Haven CT, 2/18/13

“Linking levels of analysis in computational models of corticostriatal function”, Mathematical Biosciences Institute, workshop on Cognitive Neuroscience, Columbus OH, 12/11/12

“Neurogenetic modulators of reinforcement and motor learning parameters”, Plenary Lecture, Translational Computational Motor Control meeting, New Orleans LA, 10/12/12

“Neurogenocomputomics”, Special Symposium on Neural Foundations of Reinforcement Learning, Society for Neuroeconomics annual meeting, Key Biscayne Florida, 9/29/12

“Interactive dynamics in corticostriatal circuits: Linking levels of computation and implications for psychiatry”, keynote lecture, MPS-UCL Symposium and Advanced Course on Computational Psychiatry and Ageing Research, Ringberg Castle, Bavaria, Germany 9/21/12

"Striatal contributions to learning and choice in rodents, humans and computational models", in workshop on the Striatum, Gatsby Computational Neuroscience Unit and Sainsbury Wellcome Centre for Neural Circuits and Behaviour, London England, 5/24/12

"Modeling decision-making deficits in fronto-striatal disorders", symposium on Computational Psychiatry, Neuroinformatics world congress, Boston MA, 9/4/11

"Frontal control over basal ganglia in reinforcement learning and decision-making", Summer Institute on Cognitive Neuroscience, Santa Barbara CA, 6/29/11

"Mechanisms of motivated action selection and inhibition in frontal cortex and basal ganglia". Cognitive Science Center Amsterdam, Summer Institute on Cross-Disciplinary Approaches to Impulsivity and the Inhibition of Thought and Action, Amsterdam, 6/20/11

"Interactions Between Frontal Cortex and Basal Ganglia in Volitional Control", young investigator award lecture, Cognitive Neuroscience Society annual meeting, San Francisco CA, 4/4/2011

"Frontal-subthalamic regulation of decision threshold", workshop on Neural Circuits of Decision-Making (P. Dayan, A. Karpova and J Dudman, chairs), Janelia Farm Research Campus, Ashburn VA, 3/8/11

"The Role of Dopamine in Learning and Decision Making", invited address, 'Neuroscience for Social Scientists' workshop on the Foundations of Neuroeconomics, Society for Neuroeconomics annual meeting, Evanston IL, 10/15/10

"Frontal-Subthalamic Regulation of Decision Threshold in Parkinson's Disease", Swartz Symposium on Computational Psychiatry, Yale University, 9/23/10

"Frontal-Subthalamic Regulation of Decision Processes in Parkinson's Disease", Gordon Research Conference on the Neurobiology of Cognition, Waterville Valley NH 8/5/10

"Neurogenetic and pharmacology of learning and executive control over learning", Symposium on dopamine and human decision making (R. Cools and M. Ullsperger, chairs), Federation of European Neurosciences annual meeting, Amsterdam, the Netherlands, 7/7/10

"Hierarchical reinforcement learning in corticostriatal circuits", Motivation and Cognitive Control workshop, Oxford, UK, 6/4/10

"Pharmacological and genetic modulation of decision making in corticostriatal circuits", plenary symposium, Society for Biological Psychiatry, New Orleans, LA, 5/21/10

"Neurogenetic influences on learning and executive control over learning", symposium on dopamine and adaptive memory (D. Shohamy chair), Cognitive Neuroscience Society annual meeting, Montreal Canada, 4/20/10

"Corticostriatal interactions in reinforcement-based decision making: Multiple levels of modeling", UK Neuroinformatics Node Congress, Edinburgh, UK, 2/2/10

"Neurogenetic influences on learning from experience and executive control over learning", Genetic and Experiential Influences on Executive Function meeting, Boulder CO, 1/16/10

"Dopamine, reward processing, and decision making in aging", Aging, Motivation and Addiction meeting sponsored by NIDA and NIA, Washington DC, 10/5/09

"Hierarchical cognitive control in prefrontal-basal ganglia circuits", symposium on computational modeling (K Norman chair), Memory Disorders Research Society, Chapel Hill NC, 9/25/09

"Neurocomputational models of reinforcement learning: Implications for Parkinson's disease, pharmacology and genetic". Gordon Research Conference on Catecholamines, Biddeford ME 8/12/09

"Neurocomputational models of learning and decision making: Mutiple levels of analysis". *keynote address*, Mathematical Psychology annual meeting, Amsterdam, The Netherlands, 8/2/09

"Fronto-subthalamic interactions in high conflict decisions and response inhibition: Computational and empirical studies", Symposium on neurocomputational models of speeded decision making (R Bogacz chair), Mathematical Psychology annual meeting, Amsterdam, The Netherlands, 8/2/09

"Computational neuroscience and empirical studies of reinforcement learning", 1<sup>st</sup> Annual NIMH-Sponsored Brain Camp, Cold-Spring Harbor, NY, 5/2/09

"The neurogenetics of exploration vs exploitation: Prefrontal and striatal dopaminergic components", workshop on Computational Role of Dopamine, (B Averbeck and M Frank, chairs) Computational and Systems Neuroscience (COSYNE) meeting, Snowbird UT, 3/2/09

"Neurocomputational and Genetic Components to Exploration vs Exploitation", symposium on mesocorticolimbic interactions in health and disease (A Gruber chair), Winter Conference on

Brain Research, Copper Mountain Colorado, 1/29/09

"Fronto-subthalamic interactions in high conflict decisions and response inhibition: Computational and empirical studies", Symposium on the subthalamic nucleus (C Baunez chair), Winter Conference on Brain Research, Copper Mountain Colorado, 1/27/09

"Temporal Integration of Expected Utility: Neurocomputational and Genetic Components", Open Problems in Neuroscience of Decision Making, Okinawa, Japan, 10/16/08

"Neurogenocomputomics", symposium on Neuromodulation of Lifespan Cognition, International Congress of Psychology, Berlin, Germany, 7/21/08

"Neurogenocomputomics", symposium on Computational Psychiatry, Lisbon, Portugal, 5/30/08

Interactive dynamics of corticostriatal circuits in behavioral adjustment", Workshop on "Action monitoring and behaviour adjustment", RWTH Aachen University, Aachen Germany, 3/15/08

"Interactive dynamics of corticostriatal circuits in reinforcement learning and decision making", Sustaining Performances Under Stress Symposium, University of Texas at Austin, Austin TX, 12/6/2007.

"Simulating dynamics between frontal cortex and subthalamic nucleus in high-conflict decisions and response inhibition", workshop on Translational Aspects of Stopping Movement and Action, UCSD, San Diego CA, 11/2/2007

"Neurocomputational models of frontostriatal function and dysfunction", Symposium on Computational Models of Biological Psychiatry, Computational Cognitive Neuroscience Conference, San Diego, CA, 11/1/2007

"Dynamics of frontal cortex and subthalamic nucleus in high-conflict decisions and response inhibition", workshop on neural mechanisms of stochastic decision making, Ohio State University, Columbus, OH, 9/11/2007.

"Interactive dynamics of corticostriatal circuits in reinforcement learning and decision making", in K. Gurney (Chair), "*Computational Models of the Basal Ganglia: From Molecules and Membranes to Behaviour and Cognition*". Symposium conducted at the 9th Triennial Meeting of the International Basal Ganglia Society, 9/6/2007

"Dopamine and reward calculation", Charité conference on Emotional Neuroscience, Berlin, Germany, 9/1/2007

"Interactive dynamics of striato-cortical circuits in reinforcement learning and decision making", in C. Holroyd (Chair) "*The Cognitive Neuroscience of Decision Making*". President's Symposium conducted at the Canadian Society for Brain, Behaviour and Cognitive Science, University of Victoria, Victoria, BC, 6/16/2007

"Interactive dynamics of striato-cortical circuits in reinforcement learning and decision making", Perceptual Expertise Network meeting, Yale University, 4/20/07

"The computational roles of dopamine in reinforcement learning and decision making". in J. Cohen (Chair) "*Has Reinforcement Learning Come of Age?*" Symposium conducted at the Psychonomic Society Annual Meeting, Houston TX, 11/17/06

"Evidence for a dynamic computational role of the subthalamic nucleus in decision making", in B. Knutson (Chair) "**Motivation and Emotion: Decision-Making**" Symposium conducted at the Society for Neuroscience Annual Meeting, Atlanta Georgia, 10/15/06.

"Interactive dynamics of striato-cortical circuits in reinforcement learning", workshop on the Role of Medial Frontal Cortex in Cognitive Control and Performance Monitoring, Amsterdam, the Netherlands, 6/10/2006

"Dynamic Dopamine Modulation of Striato-cortical Circuits in Reinforcement learning and Decision Making", Betty Behrens Symposium on Neural Mechanisms for Regulating Behaviour, University of Cambridge, Cambridge, UK, 8/4/2005.

"When and When Not to Use Your Subthalamic Nucleus: Lessons from a Computational Model of the Basal Ganglia", International workshop on Models of Natural Action Selection, Edinburgh, Scotland, 7/30/2005.

"Computational Perspectives on Schizophrenia: Dysfunctional Dopamine Modulation of Striato-Cortical Circuits", Cold Spring Harbor Laboratory workshop on schizophrenia and related disorders, Cold Spring Harbor, New York, 7/16/2005.

"Computational Models of Striato-Cortical Circuits in Cognition: Recent Advances and Converging Empirical Evidence." workshop on Basal Ganglia, Dopamine and Learning: Integrating Computational and Clinical Perspectives in Jerusalem, Israel, 6/29/2005.

"Modeling Cognitive Deficits in Medicated and Non-medicated Parkinson's Disease." Cognitive Neuroscience of Category Learning conference, New York, NY, 10/10/2004.

"Basal Ganglia and Dopamine in Cognition: Network Models and Behavioral Studies." John Merck Fund Summer Institute for the Biology of Developmental Disabilities, Princeton University, 7/22/2004.

### **Media Coverage:**

For various news articles see <http://ski.clps.brown.edu/inthenews.html>

Guest on Science Magazine Podcast, 10/26/07

[http://podcasts.aaas.org/science\\_podcast/SciencePodcast\\_071026.mp3](http://podcasts.aaas.org/science_podcast/SciencePodcast_071026.mp3)

Guest on National Public Radio (NPR) "Science Friday" 7/24/09

<http://www.sciencefriday.com/program/archives/200907244>

Guest on BBC Radio 5 live Drive, 4/20/11

Guest on New Hampshire Public Radio (NHPR) "Word of Mouth" 10/3/11

<http://www.nhpr.org/your-brain-pause>

Guest on *National Public Radio (NPR)* "*All Things Considered*", 8/5/13

### **Professional Activities:**

#### **Memberships**

Association for Psychological Science

Cognitive Neuroscience Society

International Basal Ganglia Society

Society for Neuroscience

Society for Neuroeconomics

#### **Editorial**

- Reviewing Editor, *eLife*, 2015-Present

- Associate Editor, *Journal of Neuroscience*, 2015- Present
- Associate Editor, *Behavioral Neuroscience*, 2014- Present
- Consulting Editor, *Psychological Review*, 2015-Present
- Contributing Editor, *European Journal of Neuroscience*, 2008 - present
- Contributing Member, Faculty of 1000 ([www.f1000.com](http://www.f1000.com)), Theoretical Neuroscience section, 2008- present
- Consulting Editor, *Journal of Mathematical Psychology*, Jan 2010 – 2014
- Guest editor (with Nathaniel Daw), special issue of *Cognition*, Reinforcement learning, 2009.
- Guest editor (with Quentin Huys and Tiago Maia), special issue of *Biological Psychiatry*, *Computational Psychiatry*, 2017
- External action editor, *PLoS Biology*, 2016; *J Experimental Psychology: General*, 2013
- Editorial Board, *Connection Science*, 2014-Present
- Editorial Board, *Motivational Science*, 2014-Present

### **Reviewing (Grants)**

NIMH Reviewer Interventions/Biomarkers panel, 2016, 2017  
 NIH Reviewer Integrative, Functional and Cognitive Neuroscience panel 2012, 2013  
 NSF Review Panel, 2016  
 NSF Proposal Reviewer, ad-hoc  
 Agence National de la Recherche (French National Agency)  
 Biotechnology and Biological Sciences Research Council  
 NWO (Netherlands Organisation for Scientific Research)  
 Neurological Foundation of New Zealand  
 NSERC Discovery Grants (Canada)  
 Parkinson's Disease Society of the UK  
 Swiss National Science Foundation  
 The Wellcome Trust  
 UK Economic and Social Research Council

### **Reviewing (Publications; ad-hoc)**

*American Journal of Psychiatry, Behavioral and Brain Sciences, Behavioural Brain Research, Behavioural Processes, Biological Psychiatry, Brain, Brain and Cognition, Brain and Language, Brain Research, Cerebral Cortex, Cognition, Cognitive Affective and Behavioral Neuroscience, Cognitive Science Society Annual Meeting, Cambridge Handbook on Computational Cognitive Modeling, Clinical Psychological Science, Current Biology, Depression & Anxiety, European Journal of Neuroscience, Frontiers in Behavioral Neuroscience, Frontiers in Computational Neuroscience, Handbook of Basal Ganglia Structure and Function, Hippocampus, International Journal of Neuropsychopharmacology, International Journal of Psychophysiology, JAMA Psychiatry, Journal of Cognitive Neuroscience, Journal of Computational Neuroscience, Journal of Experimental Psychology: General, Journal of Neurology, Journal of Neurophysiology, Journal of Neuroscience, Learning & Memory, Memory & Cognition, Movement Disorders, Nature, Nature Neuroscience, Neural Computation, Neural Networks, Neurobiology of Aging, NeuroImage, Neuron, Neuropsychologia, Neuroscience & Biobehavioral Reviews, Perception & Psychophysics, Proceedings of the National Academy of Sciences, Psychological Review, Psychological Science, Psychonomic Bulletin & Review, Psychopharmacology, PLoS Biology, PLoS ONE, Science, Topics in Cognitive Science, Trends in Cognitive Sciences*

### **Professional Service**

- Director, Initiative for Computation in Brain and Mind at Brown U, 2012-present
- Associate Chair of Graduate Studies, Cognitive, Linguistic & Psychological Sciences July 2017 – present
- Program Committee, International Convention of Psychological Science, 2013-15



- Program committee, Multidisciplinary Conference on Reinforcement Learning and Decision Making: Princeton 2013, Alberta 2015, Ann Arbor 2017
- Program Committee, Collaborative Research on Computational Neuroscience (CRCNS) conference, Brown University 2017
- Cognitive Neuroscience Society Young Investigator Award Committee, 2015-present
- Co-organized first Computational Psychiatry Conference, Miami FL. 10/22–23, 2013
- Co-organized computational psychiatry workshop satellite to Biological Psychiatry conference, San Diego CA 5/17/17
- Organized symposium on “Computational models of basal ganglia physiology and function”, International Basal Ganglia Society, Eilat Israel, 3/5/2013
- Co-chair in symposium on “Individual Differences in Dopamine Signaling: Role in Learning, Risk Taking, and Impulsivity”, Dopamine 2013, Alghero Italy, 5/24/13
- Co-organized workshop on "The computational role of dopamine", Computational and Systems Neuroscience (Cosyne 2009), Snow Bird Utah, 3/2/2009
- Organized symposium on "Computational models of biological psychiatry" at the Computational Cognitive Neuroscience Conference, San Diego, 11/2/2008
- Provide assistance to researchers using neural modeling software for simulating basal ganglia interactions in learning and associated neurological dysfunction (2005 – present)
- Panel member, Cognitive Neuroscience Treatment Research for Improving Cognition in Schizophrenia (CNTRICS)
- Participated in Deep Brain Stimulation (DBS) Consensus Conference to provide recommendations for patients with medically intractable Parkinson disease to patients and physicians. Advised on cognitive disturbances of medication and DBS. 4/2 – 4/3, 2009, New York, NY.
- Academic Advisor for freshman students, Brown University, 2010-2012

### **Teaching**

Computational Cognitive Neuroscience, 2007/08/09/10/11/12/13/14/15/16

Doing Bayesian Data Analysis 2013

Mechanisms of Motivated Decision making, Spring 2011, 2017

Cognitive Control Functions of the Prefrontal Cortex, Spring 2010

Reinforcement Learning, graduate seminar, Fall 2007

Seminar on Computational Approaches to Cognitive Neuroscience, Fall 2006

Computational Cognitive Functions of the Prefrontal Cortex, graduate seminar, Spring 2006

*Guest Lecturer:* Systems Neuroscience, Fall 2009

Advanced Cognitive Neuroscience, Spring 2009

Foundations in Cognitive Psychology, Spring 2006, 2007, 2008

Neural Dynamics, Fall 2013

Cognition core graduate course, Fall 2016

### **Supervision (current)**

Nicholas Franklin, graduate student, 2011 – present

Daniel Scott, graduate student, 2016 – present

Harrison Ritz, graduate student, 2016 – present

Matthew Nassar, postdoctoral 2013 – present

Andra Geana, postdoctoral 2016 – present

Andrew Westbrook, postdoctoral 2016 – present

Arif Hamid, postdoctoral 2016 – present

Mads Pedersen, postdoctoral 2017 – present

Prannath Moolchand, graduate student, 2012 – present

Daniel Dillon, co-mentor for K99/R00 2012- present

**Supervision (completed)**

Jim Cavanagh (Ph.D. co-advisor, 1/07 – 8/10, now Asst Prof U New Mexico)

Jim Cavanagh, Postdoctoral 2010 – 2014, now Asst Prof U New Mexico

Anne Collins, Postdoctoral 2010 – 2015, now Asst Prof UC Berkeley

Jeff Cockburn, graduate student 2009 – 2015, now postdoc CalTech

Thomas Wiecki, graduate student, 2010 – 2014, now director of data science at Quantopian Inc

Michael X. Cohen (Postdoctoral supervisor 08-09, now Asst Prof, Univ. Amsterdam)

Ahmed Moustafa (Postdoctoral supervisor 2006-2007, now Asst Prof Univ W Sydney Australia)

Nathan Vierling-Claasen, postdoctoral, 2013 – 2016, now data scientist Wayfair

Bradley Doll (Ph.D. advisor, 5/06-7/11, now data scientist, about.com)

Catherine Hegarty, graduate student rotation 2011-2012 (NIH-Brown Graduate Program)

Minryung Song, neuroscience graduate program lab rotation, Fall 2008

Christina Figueroa, research assistant, lab manager, Fall 2007 – 2011

Sean Masters, research assistant, lab manager, July 2011 - 2013

Rosa Senatore, visiting graduate student, Jan 2011 – Sept 2011

**Other Work Experience:****PREDICTION COMPANY**

Santa Fe, New Mexico

June 2001 - June 2003

(consultant office in Boulder, CO)

Software Developer and Research Consultant

- Designed and developed neural network software for detecting stock market patterns

**UNIDEN SAN DIEGO R&D CENTER**

San Diego, CA

October 1997- August 1998

Staff engineer

- Systems Integration and Test Engineer, hardware and software design for cellular phone.

**MONTREAL NEUROLOGICAL INSTITUTE**

Montreal, Quebec

May 1996 - August 1996

Biomedical engineering research assistant

- Developed software to manipulate magnetic resonance images (MRI) for analysis of epileptic brain anatomy and to map electroencephalogram (EEG) activity on the MR images.

**Personal Information:**

Born: November 22, 1974 in Montreal, Quebec, Canada