# Schedule

## Events for: Monday, January 27th - Friday, January 31st

## Monday, January 27th

## 9:30am Opening Remarks - SCGP 102

Title: Opening Remarks

#### 9:45am Tali Tishby - SCGP 102

Speaker: Tali Tishby

Title: The dynamics that lead to generalization in Deep learning

#### 10:30am Coffee Break - SCGP cafe

#### 11:00am Dmitri Chklovskii - SCGP 102

Speaker: Dmitri Chklovskii

Title: TBA

#### 11:45am Nicolas Brunel - SCGP 102

Speaker: Nicolas Brunel

Title: TBA

12:30pm Lunch - SCGP cafe

2:00pm Braden Brinkman - SCGP 102

Speaker: Braden Brinkman

Title: A non-perturbative renormalization group analysis of strongly-coupled spiking networks

Abstract: TBA

#### 2:45pm Giancarlo La Camera - SCGP 102

Speaker: Giancarlo La Camera

Title: Temporal stimulus segmentation by reinforcement learning in populations of spiking neurons

**Abstract:** Stimulus identification is the process of picking out a particular stimulus among many other stimuli which may be present in the environment, for the purpose of performing a task. In the most interesting yet demanding scenario, the problem amounts to extracting action-relevant segments out of a noisy input stream, thus also involving the extrapolation of the beginning and the end of relevant stimulus features, not known a priori. In a typical framework, the identity and timing of the relevant stimuli are known to the learning agent. Departing from this view, I introduce an autonomous learning system able to identify action-relevant stimuli without prior knowledge of them, while learning to ignore stimuli that are not behaviorally relevant. The model is based on ensembles of spiking neurons able to handle spatiotemporal patterns of spike trains reminiscent of those recorded in alert animals performing decision tasks. It uses a biologically plausible learning rule for maximizing the average reward obtained for correct decisions taken at the right time. Performance of the model on surrogate and cortical datasets is robust to stimulus noise and multiple coding strategies, providing an example of a spiking network model able to solve multi-choice decision tasks in the absence of prior information on the relevance and timing of input stimuli.

3:30pm Coffee Break - SCGP cafe

4:00pm Jin Wang - SCGP 102

#### Speaker: Jin Wang

**Title:** Nonequilibrium neural network dynamics and thermodynamics revealed by the global landscape and flux quantifications

Abstract: The brain map project aims to map out the neuron connections of the human brain. Even with all the wirings mapped out, the global and physical understandings of the function and behavior are still challenging. Hopfield quantified the learning and memory process of symmetrically connected neural networks globally through equilibrium energy. The energy basins of attractions represent memories and the memory retrieval dynamics is determined by the energy gradient. However, the realistic neural networks are asymmetrically connected and oscillations cannot emerge from symmetric neural networks. Here, we developed a non-equilibrium landscapeflux theory for realistic asymmetrically connected neural networks [1]. We uncovered the underlying potential landscape and the associated Lyapunov function for quantifying the global stability and function. We found the dynamics and oscillations responsible for cognitive processes and physiological rhythm regulations are determined not only by the landscape gradient but also by the flux. We found that the flux is closely related to the degrees of the asymmetrical connections in neural networks and is the origin of the neural oscillations. The neural oscillation landscape shows a closed ring attractor topology. The landscape gradient attracts the network down to the ring. The flux is responsible for coherent oscillations on the ring. We suggest the flux may provide the driving force for associations among memories. We applied our theory to rapid eye movement (REM) sleep cycle. We identified the key regulation factors for function through global sensitivity analysis of landscape topography against wirings. Our predictions are consistent with experimental observations. For decision making in the brain, a quantitative description of global attractor landscapes has not yet been completely given. Here, we developed a theoretical framework to quantify the landscape associated with the steady state probability distributions and associated steady state curl flux, measuring the degree of non-equilibrium through the degree of detailed balance breaking for decision making [2]. We quantified the decision-making processes with optimal paths from the undecided attractor states to the decided attractor states, which are identified as basins of attractions, on the landscape. Both landscape and flux determine the kinetic paths and speed. The kinetics and global stability of decision making are explored by quantifying the landscape topography through the barrier heights and the mean first passage time. Our theoretical predictions are in agreements with the experimental observations: more errors occur under time pressure. We quantitatively explored two mechanisms of the speed-accuracy tradeoff with speed emphasis and further uncovered the tradeoffs among speed, accuracy, and energy cost. Our results imply that there is an optimal balance among speed, accuracy, and the energy cost in decision making. We uncovered the possible mechanisms of changes of mind and how mind changes improve performance in decision processes. Our landscape approach can help facilitate an understanding of the underlying physical mechanisms of cognitive processes and identify the key factors in the corresponding neural networks. [1] H. Yan, L. Zhao, L. Hu, X. Wang, E.K. Wang, J. Wang\*. Nonequilibrium landscape theory of neural networks. Proc. Natl. Acad. Sci. USA.110, E4185-E4194 (2013). [2] H. Yan, K. Zhang, J. Wang\*. Physical mechanism of mind changes and tradeoffs among speed, accuracy, and energy cost in brain decision making- Landscape, flux, and path perspectives. Chinese Phys. B. 25(7), 078702. (2016)

#### Speaker: Ari Pakman

Title: Neural Clustering Processes

### **Tuesday, January 28th**

#### 9:45am Arianna Maffei - SCGP 102

Speaker: Arianna Maffei

Title: Circuit mechanisms for learning in sensory cortex

#### 10:30am Coffee Break - SCGP cafe

#### 11:00am Carina Curto - SCGP 102

Speaker: Carina Curto

Title: Dynamically relevant motifs in inhibition-dominated networks

**Abstract:** Many networks in the nervous system possess an abundance of inhibition, which serves to shape and stabilize neural dynamics. The neurons in such networks exhibit intricate patterns of connectivity whose structure controls the allowed patterns of neural activity. In this work, we examine inhibitory threshold-linear networks whose dynamics are constrained by an underlying directed graph. We develop a set of parameter-independent graph rules that enable us to predict features of the dynamics, such as emergent sequences and dynamic attractors, from properties of the graph. These rules provide a direct link between the structure and function of these networks, and may provide new insights into how connectivity shapes dynamics in real neural circuits.

11:45am Lunch - SCGP cafe

1:00pm SCGP Weekly Talk: Misha Tsodyks

Speaker: Misha Tsodyks

Title: Mathematical models of human memory

**Abstract:** Human memory is a multi-staged phenomenon of extreme complexity, which results in highly unpredictable behavior in real-life situations. Psychologists developed classical paradigms for studying memory in the lab, which produce easily quantifiable measures of performance at the cost of using artificial content, such as lists of randomly assembled words. I will introduce a set of simple mathematical models describing how information is maintained and recalled in these experiments. Surprisingly, they provide a very good description of experimental data obtained with internet-based memory experiments on large number of human subjects. Moreover, more detailed mathematical analysis of the models leads to some interesting ideas for future experiments with potentially very surprising results.

#### 2:00pm Jim DiCarlo - SCGP 102

Speaker: Jim DiCarlo

Title: Reverse Engineering Visual Intelligence

#### 2:45pm Stefano Fusi - SCGP 102

Speaker: Stefano Fusi

Title: The geometry of abstract neural representations

#### 3:30pm Coffee Break - SCGP cafe

#### 4:00pm Ken Miller - SCGP 102

Speaker: Ken Miller

Title: TBA

4:45pm Memming Park - SCGP 102

Speaker: Memming Park

**Title:** Stimulus-choice population code (mis)alignment in the middle temporal cortex during perceptual decision-making

Abstract: For stimuli near perceptual threshold, the trial-by-trial activity of single neurons in many sensory areas is correlated with the animal's perceptual report. This phenomenon has often been attributed to feedforward readout of the neural activity by the downstream decision-making circuits. The interpretation of choice-correlated activity can be better understood in the light of populationwide correlations among sensory neurons. Using a statistical nonlinear dimensionality reduction technique on single-trial ensemble recordings from the middle temporal area during perceptualdecision-making, we extracted low-dimensional neural trajectories that captured the populationwide fluctuations. We dissected the particular contributions of sensory-driven versus choicecorrelated activity in the low-dimensional population code. We found that the neural trajectories strongly encoded the direction of the stimulus in single dimension with a temporal signature similar to that of single MT neurons. If the downstream circuit were optimally utilizing this information, choice-correlated signals should be aligned with this stimulus encoding dimension. Surprisingly, we found that a large component of the choice information resides in the subspace orthogonal to the stimulus representation inconsistent with the optimal readout view. This misaligned choice information allows the feedforward sensory information to coexist with the decision-making process. The time course of these signals suggest that this misaligned contribution likely is feedback from the downstream areas. We hypothesize that this non-corrupting choice-correlated feedback might be related to learning or reinforcing sensory-motor relations in the sensory population.

## Wednesday, January 29th

#### 9:45am Bruce Cumming - SCGP 102

Speaker: Bruce Cumming

**Title:** Disparity as a tool to understand how cortical neurons exploit the statistics of the natural environment

10:30am Coffee Break - SCGP cafe

11:00am Chuck Stevens - SCGP 102

Speaker: Chuck Stevens

Title: A maximum entropy combinatorial code for two quite different neural systems

Abstract: In this talk I describe the fly olfactory encoding of odors, and the monkey encoding of human faces. These quite different systems will be shown to use the same maximum entropy combinatorial code. Roughly speaking, a maximum entropy combinatorial code will encode the largest number of objects with the smallest number of neurons. Fly olfaction. The fly's nose has multiple copies of each of about 50 genetically different types odorant receptors. Each odorant receptor type converges on one of each of 50 different types of glomeruli in the antenna lobe of the fly olfactory system, and each glomerulus type supplies odorant information to one type of projection neuron that removes concentration dependence of the odor response and sends the odor information to 2000 Kenyon cells in the mushroom body of the fly. Most odors activate most of the 50 types of odorant receptors and projection neurons. If the firing rates of activated projection neurons are measured and the average firing rate is calculated, every odor gives the same average value. And if the distribution of firing rates is estimated, the distribution is the same exponetial for every odor. What is different from one odor to the next is which projection neurons are firing at which rates. That is, the odor identity is encoded by which projection neurons are firing at the highest rates for that odor. This type of combinatorial code is known to be maximum entropy. Monkey face code. Visual information is sent to six distinct face patches in the monkey inferior temporal cortex, and the information is distributed between the different patches. The anterior medial face patch provides outputs for the face systems. Most of the neurons in a face patch respond specifically to faces, and Doris Tsao presented 2000 human faces in two monkeys, and recorded from about 100 neurons in the output face patch. Most of the 100 neurons responded to most faces, and non-responding neurons were just silent. The average firing rate for responding neurons was the same for all 2000 faces, and when the cumulative distributions for all 2000 faces are superimposed, they are found to be exponentially distributed with the same mean far all faces. Thus, the fly olfactory system and the monkey face system both encode their objects with just the same maximum entropy code.

#### 11:45am Brent Doiron - SCGP 102

Speaker: Brent Doiron

Title: Information flow in excitatory and inhibitory cortical circuits

12:30pm Lunch - SCGP cafe

#### 2:00pm Surya Ganguli - SCGP 102

Speaker: Surya Ganguli

Title: TBA

#### 2:45pm Luca Mazzucato - SCGP 102

Speaker: Luca Mazzucato

Title: Metastable attractors explain the variable timing of stable behavioral action sequences

Abstract: Natural animal behavior displays rich lexical and temporal dynamics, even in a stable environment. This implies that behavioral variability arises from sources within the brain, but the origin and mechanics of these processes remain largely unknown. Here, we focus on the observation that the timing of self-initiated actions shows large variability even when they are executed in stable, well-learned sequences. Could this mix of reliability and stochasticity arise within the same circuit? We trained rats to perform a stereotyped sequence of self-initiated actions and recorded neural ensemble activity in secondary motor cortex (M2), which is known to reflect trial-by-trial action timing fluctuations. Using hidden Markov models we established a robust and accurate dictionary between ensemble activity patterns and actions. We then showed that metastable attractors, with the requisite combination of reliable sequential structure and high transition timing variability, could be produced by reciprocally coupling a high dimensional recurrent network and a low dimensional feedforward one. Transitions between attractors were generated by correlated variability arising from the feedback loop between the two networks. This mechanism predicted a specific structure of low-dimensional noise correlations that were empirically verified in M2 ensemble dynamics. This work suggests a robust network motif as a novel mechanism to support critical aspects of animal behavior and establishes a framework for investigating its circuit origins via correlated variability.

#### 3:30pm Coffee Break - SCGP cafe

#### 4:00pm David Hansel - SCGP 102

Speaker: David Hansel

Title: Theory of orientation selectivity in rodent primary visual cortex

#### 4:45pm Anitha Pasupathy - SCGP 102

Speaker: Anitha Pasupathy

Title: TBA

#### Thursday, January 30th

#### 9:45am Barry Richmond - SCGP 102

Speaker: Barry Richmond

Title: What is being computed where in the ventral visual stream and beyond

#### 11:00am Tatiana Engel - SCGP 102

Speaker: Tatiana Engel

Title: Discovering interpretable models of neural population dynamics from data

**Abstract:** Significant advances have been made recently to develop powerful machine learning methods for finding predictive structure in neural population recordings. However, most these techniques compromise between flexibility and interpretability. While simple ad hoc models are likely to distort defining features in the data, flexible models (such as artificial neural networks) are difficult to interpret. We developed a flexible yet intrinsically interpretable framework for discovering neural population dynamics from data. In our framework, population dynamics are governed by a non-linear dynamical system defined by a potential function. The activity of each neuron is related to the population dynamics through unique firing-rate functions, which account for heterogeneity of neural responses. The shapes of the potential and firing-rate functions are simultaneously inferred from data to provide high flexibility and interpretability. Using this framework, we find that good data prediction does not guarantee accurate interpretation of the model, and propose an alternative strategy for deriving models with correct interpretation. We demonstrate the power of our approach by discovering metastable dynamics in spontaneous spiking activity in the primate area V4.

#### 11:45am William Marshall - SCGP 102

Speaker: William Marshall

Title: Causal Emergence: Can Macro Beat Micro?

12:30pm Lunch - SCGP cafe

#### 2:00pm David Schwab - SCGP 102

Speaker: David Schwab

Title: TBA

#### 2:45pm Misha Tsodyks - SCGP 102

**Speaker:** Misha Tsodyks

Title: TBA

#### 3:30pm Coffee Break - SCGP cafe

#### 4:00pm Paul Miller - SCGP 102

Speaker: Paul Miller

Title: Multistable, metastable, and quasi-stable attractor states in cognitive processing

#### 4:45pm Mike Douglas - SCGP 102

Speaker: Mike Douglas

Title: How will we do mathematics in 2030?

**Abstract:** We make the case that over the coming decade, computer assisted reasoning will become far more widely used in the mathematical sciences. This includes interactive and automatic theorem verification, symbolic algebra, and emerging technologies such as formal knowledge repositories, semantic search and intelligent textbooks. After a short review of the state of the art, we survey directions where we expect progress, such as mathematical search and formal abstracts, developments in computational mathematics, integration of computation into textbooks, and organizing and verifying large calculations and proofs. For each we try to identify the barriers and potential solutions.

#### Friday, January 31st

#### 9:45am Bruno Averbeck - SCGP 102

Speaker: Bruno Averbeck

Title: Dimensionality, Information and Learning in Prefrontal Cortex

#### 10:30am Coffee Break - SCGP cafe

#### 11:00am Cengiz Pehlevan - SCGP 102

Speaker: Cengiz Pehlevan

**Title:** Statistical Mechanics of Generalization in Kernel Machines and Deep Networks in the Infinite-Width Limit

11:45am Tilo Schwalger - SCGP 102

Speaker: Tilo Schwalger

Title: Mesoscopic mean-field models for spiking neural networks

12:30pm Lunch - SCGP cafe

## 2:00pm Final Remarks and Farewell - SCGP 102

Title: Final Remarks and Farewell