

Berlin Bernstein Conference on Computational Neuroscience 27|09 - 01|10 2010

Research Results
of the BCF
presented at:



The Berlin
Bernstein
Neuroscie
neural Sympo
Computatio
Neuroscie
The BCCN is a
Computatio
Neuroscie
The submitte
all relevant disc
Selected
abstracts will be p
in the journal Frontiers in Computa
tional Neuroscience.

www.bccn2010.de

KEYNOTES AND EVENTS

- 27/09** Bernstein Award 2010, Eisner for Eisner Award
- 28/09** Lars Kai Hansen, Technical University of Denmark
Ernst Ritz, University of Zurich, Switzerland
- 28/09** Pascal Fries, Ernst Strüngmann Institute (ESI) in
Cooperation with Max Planck Society, Germany
Peer Jonas, Albert-Ludwigs-Universität Freiburg, Germany
- 30/09** Michal Tsodyks, Weizmann Institute of Science, Israel
Gero Miesenböck, University of Oxford, UK
- 01/10** PhD-Symposium

PROGRAM COMMITTEE

Klaus Robert Müller (general chair), Daniele Riguzzi, Matthias Bethge, Armin Blass, Benjamin Blankertz, Axel Borst, Martin Buehlhoff, Gabriel Durró, Ulrich Egerl, Roland Fleming, Alexander Gal, Jan Gädicke, Tim Gollisch, Ralf Häusser, John-Dylan Haynes, Leo van Hateren, Andreas Herz, Frank Heze, Christian Loh, Dirk Sussilo, Christoph Taylor, Richard Sengco, Peter König, Christian Leibold, Sebastian Müller, Klaus-Robert Müller, Andreas Neef, Hans Obermayer, Stefano Panzeri, Petra Ritter, Constantin Rothkopf, Gregor Schöner, Jens Siebhorn, Jochen Triesch, Thomas Wachtler, Felix Wichmann, Laurent Wiskott, Annette Witt, Gabriel Witten



Structural motifs and correlation dynamics in networks of spiking neurons

Volker Pernice^{1*}, Benjamin Staude¹ and Stefan Rotter¹

¹ Albert-Ludwig University, Bernstein Center Freiburg & Faculty of Biology, Germany

The dynamics of random recurrent networks has been analyzed in detail, but the influence of non-random connectivity pattern on activity dynamics is not well understood. Here we study the effect of certain structural motifs on pairwise correlations in networks of excitatory and inhibitory neurons in a balanced asynchronous-irregular state. For analytical tractability, spike trains are conceived as linearly interacting stochastic point processes. In this case, firing rates and correlation functions are fully determined by the matrix of linear response kernels. Simple analytic expressions have been derived in [2]. We find that the matrix of integrated cross-covariance functions can be written as a power series of the underlying network's connectivity matrix. In terms of network structure, higher matrix powers of this series expansion can be interpreted as contributions of motifs of increasing complexity. Generally, such higher order motifs can strongly affect correlations. Their impact can be estimated from the spectral radius of the connectivity matrix. Using numerical simulations, we demonstrate that not only differences in average in-degree and connectivity but also in higher order motif distributions can lead to dramatic effects regarding pairwise correlations. To illustrate the influence of network structure in more detail, we study connectivity matrices with certain symmetry properties. Specifically we focus on dependent connectivity profiles. The distance dependence of correlations can then be determined from the connectivity profile. The influence of higher order contributions can be understood analytically.

References

- [1] Song S., Per S., Reigl M., Nelson S., Chklovskii D. (2005). Highly nonrandom features of synaptic connectivity in local cortical circuits. *PLoS Biol*
[2] Hawkes, A. G. (1971). Point spectra of some mutually exciting point processes. *Journal of the Royal Statistical Society (London) B*, 33, 438-443

Keywords : Computational neuroscience

Conference : Bernstein Conference on Computational Neuroscience, Berlin, Germany, 27 Sep - 1 Oct, 2010.

Presentation Type : Poster Abstract

Topic : Bernstein Conference on Computational Neuroscience

Citation : Pernice V, Staude B and Rotter S (2010). Structural motifs and correlation dynamics in networks of spiking neurons. *Front. Comput. Neurosci. Conference on Computational Neuroscience*. doi: 10.3389/conf.fncom.2010.51.00073

Received : 15 Sep 2010; Published Online: 23 Sep 2010.

* Correspondence : Dr. Volker Pernice, Albert-Ludwig University, Bernstein Center Freiburg & Faculty of Biology, Freiburg, Germany, pernice@bcf.uni-freiburg.de



NeurOnline: A software framework to perform online analysis and control of electrophysiological recordings

Maxime Ambard^{1*}, Armin Brandt² and Stefan Rotter^{1, 3}

¹ Albert-Ludwig University Freiburg, Bernstein Center Freiburg, Germany

² University Clinic Freiburg, Epilepsy Center, Germany

³ Albert-Ludwig University Freiburg, Faculty of Biology, Germany

The interaction with neuronal networks in electrophysiological experiments is a difficult and often crucial task, requiring up-to-date information about the dynamic state of the network. Electrode arrays, in principle, allow a very detailed observation of system state because multiple sites can be recorded simultaneously. However, the online and on-site analysis of such high-dimensional data obtained with a high sampling rate requires a well-designed data analysis system.

The NeurOnline project aims at developing an open-source software framework to be used by experimentalists to perform online analyses of electrophysiological recordings made with various experimental setups. It consists of an integrated set of Python code that control C++ code. The Python language opens the possibility to design, implement and apply the analysis on-site, because it makes the extension of existing modules and the creation of new ones comparatively easy. The C++ language ensures high performance. The latter is crucial for online analysis, especially when multiple channels are recorded with high sampling rate.

The collaboration of this software development project with two laboratories at the University of Freiburg has already led to promising applications and first results. (1) In the Biomicrotechnology lab (IMTEK) Patrick Dini studies the dynamics of neuronal assemblies cultured on high-density multi-electrode arrays. NeurOnline is currently used to record and filter the data, to detect and sort spikes, and to schedule the successive selection of electrode subsets. The small distance between electrodes (14µm), in combination with new online analysis algorithms, allow us to follow action potential propagation across the electrode array with unprecedented detail. (2) In the Neurobiology and Biophysics lab (Faculty of Biology), Jens Kremkow uses visual stimuli to activate neurons in the thalamus and the visual cortex of anesthetized rats. He employs adaptive stimulus sampling, which involves the visual stimulus depending on the recorded activity of neurons. The use of NeurOnline to record data, to detect and sort spikes and to control the display of visual stimuli leads to a fast and reliable online receptive field characterization of cells in the LIP and V1.

Keywords : Computational neuroscience

Conference : Bernstein Conference on Computational Neuroscience, Berlin, Germany, 27 Sep - 1 Oct, 2010.

Presentation Type : Presentation

Topic : Bernstein Conference on Computational Neuroscience

Citation : Ambard M, Brandt A and Rotter S (2010). NeurOnline: A software framework to perform online analysis and control of electrophysiological recordings. *Frontiers in Computational Neuroscience*. Conference Abstract: Bernstein Conference on Computational Neuroscience. doi: 10.3389/conf.fncom.2010.51.00112

Received : 06 Sep 2010; Published Online: 23 Sep 2010.

* Correspondence : Dr. Maxime Ambard, Albert-Ludwig University Freiburg, Bernstein Center Freiburg, Freiburg, Germany, maxime.ambard@bcf.uni-freiburg.de



Non-equilibrium encoding of time-dependent input signals by neurons with effective refractoriness

Moritz Deger^{1*}, Moritz Helias², Stefano Cardanobile¹, Fatihcan M. Atay³ and Stefan Rotter¹

¹ Albert-Ludwig University, Bernstein Center Freiburg & Faculty of Biology, Germany

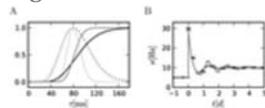
² Brain Science Institute, RIKEN, Japan

³ Max Planck Institute for Mathematics in the Sciences, MPI, Germany

Spike trains emitted by cortical neurons can be effectively described by stochastic point processes. The Poisson process with refractoriness is a particularly simple point process, which admits the mathematical analysis of its dynamic properties. As well as through the generalization to randomly distributed refractory times (Fig. A), this process can represent a large class of well-renewal processes, including certain types of gamma- and log-normal processes. These are frequently used models for static neuronal spike trains. To study the non-equilibrium dynamics of ensembles of such processes we employ a description in terms of occupation numbers of two states: Active and refractory. These occupation numbers follow a distributed delay differential equation. Based on this dynamics, the time-dependent spike rate of an ensemble of processes encoding an arbitrary input trajectory is studied. In particular, we consider the case of a step change of the input rate, which induces a stochastic transient of the output rate (Fig. B). Moreover, for the periodic response to periodic input profiles, we obtain the mapping of the discrete spectra of input and output, by which all harmonics are coupled linearly, with coefficients depending on the refractoriness. For the special case of a cosine input and a fixed refractory time, we find resonances, phase jumps and frequency doubling in the time-dependent output spike rate. Since a large class of renewal processes can be represented as Poisson processes with random refractory time, our approach represents a widely applicable framework to define and analyze non-stationary point process models of neural activity.

Figure 1: Ensemble of Poisson processes with random refractoriness, with different widths of the refractory time distribution. A: Probability density of refractory time (dotted lines) and normalized hazard function for constant input rate (solid lines). B: Time course of the ensemble rate upon step change of the input rate at $t=0$. Theoretical result (solid lines) and simulation of an ensemble of processes averaged over 225 trials (crosses). Error bars denote the standard deviation over trials.

Figure 1



Keywords : Computational neuroscience

Conference : Bernstein Conference on Computational Neuroscience, Berlin, Germany, 27 Sep - 1 Oct, 2010.

Presentation Type : Presentation

Topic : Bernstein Conference on Computational Neuroscience

Citation : Deger M, Helias M, Cardanobile S, Atay FM and Rotter S (2010). Non-equilibrium encoding of time-dependent input signals by neurons with effective refractoriness. *Front. Comput. Neurosci. Conference Abstract: Bernstein Conference on Computational Neuroscience*. doi: 10.3389/conf.fncom.2010.51.00024

Received : 20 Sep 2010; Published Online: 23 Sep 2010.

* Correspondence : Dr. Moritz Deger, Albert-Ludwig University, Bernstein Center Freiburg & Faculty of Biology, Freiburg, Germany, deger@bcf.uni-freiburg.de



The impact of spiking irregularity on the estimation of higher-order correlations

Imke C G. Reimer^{1*}, Benjamin Staude¹ and Stefan Rotter¹

¹ Albert-Ludwig University, Bernstein Center Freiburg & Faculty of Biology, Germany

Nonlinear response properties make neurons extremely sensitive to the higher-order structure of their input [1]. Whether or higher-order correlations are important for cortical information processing, however, can only be decided by the analysis of experimental data.

Common data analysis methods [2] to investigate the potential role of higher-order correlations assign one correlation parameter each subgroup of N neurons, yielding $2^N - 1$ parameters to be estimated. The corresponding requirements with respect to the size renders the application of these methods to electrophysiological recordings of the spike activity of large populations impractical. In contrast, the recently developed empirical de-Poissonization (EDP) [3] aims for population-averaged correlations, and requires only one parameter per order of correlation (i.e., N parameters in total), resulting in a biologically feasible requirement regarding sample size. Specifically, EDP infers higher-order correlations from the population spike count.

A central assumption of higher-order correlation measures is that the values in subsequent counting windows are independent single-neuron spike trains, this effectively implies Bernoulli or Poisson statistics. Recent studies investigating spiking irregularity however, emphasize that Poissonian spiking is not common to neurons in all brain areas [4]. For instance, neurons in motor areas tend to fire much more regular than those in visual areas. Hence, in order to avoid misinterpretation of results, the impact of irregularity on higher-order correlation measures has to be investigated. This, in turn, requires a method to generate surrogates with prescribed irregularity that at the same time allows to control the higher-order correlation structure of the population. In this contribution, we extend the “thinning method” [5] to generate populations of correlated non-Poissonian spike trains. Specifically, we consider log-normal interspike-interval distributions for which the higher-order structure can be controlled in biologically realistic regimes. The robustness of EDP is then investigated by systematically simulating and analyzing such log-normal populations. We find that the results are the more biased the larger the counting window is. The maximal order of correlation to be underestimated for regular spiking, while it may be overestimated for very irregular spiking.

References

- [1] Abeles, *Corticonics - Neural Circuits of the Cerebral Cortex* (Cambridge University Press, 1991); Bohte et al, *Neural Comput* **12**, 153 (2000); Kulkarni et al, *Neural Comput* **15**, 67 (2003)
- [2] Martignon et al, *Biol Cybern* **73**, 69 (1995); Martignon et al, *Neural Comput* **12**, 2621 (2000); Amari et al, *Neural Comput* **15**, 127 (2003)
- [3] Ehm et al, *Electronic Journal of Statistics* **1**, 473 (2007)
- [4] Shinomoto et al, *PLoS Comput Biol* **5**, e1000433 (2009); Maimon & Assad, *Neuron* **62**, 426 (2009)
- [5] Lewis & Shedler, *Naval Research Logistics Quarterly* **26**, 403 (1979); Devroye, *Non-uniform Variate Generation* (Springer, New York, 1986); B. Gerstein, *Neural Comput* **12**, 2597 (2000)

Keywords : Computational neuroscience

Conference : Bernstein Conference on Computational Neuroscience, Berlin, Germany, 27 Sep - 1 Oct, 2010.

Presentation Type : Poster Abstract

Topic : Bernstein Conference on Computational Neuroscience

Citation : Reimer IG, Staude B and Rotter S (2010). The impact of spiking irregularity on the estimation of higher-order correlations. *Front. Comput. Neurosci. Conf. Abstract: Bernstein Conference on Computational Neuroscience*. doi: 10.3389/conf.fncom.2010.51.00082

Received : 14 Sep 2010; Published Online: 23 Sep 2010.

* Correspondence : Dr. Imke C G Reimer, Albert-Ludwig University, Bernstein Center Freiburg & Faculty of Biology, Freiburg, Germany, reimer@bcf.uni-freiburg.de



An Online Brain-Machine Interface Using Decoding Of Movement Direction From The Human Electrocorticogram

Tomislav Milekovic^{1, 2*}, Joerg Fischer², Tonio Ball^{1, 3}, Andreas Schulze-Bonhage^{1, 3}, Ad Aertsen^{1, 4} and Carsten Mehring^{1, 2}

¹ Albert-Ludwigs-University Freiburg, Bernstein Center for Computational Neuroscience, Germany

² Albert-Ludwigs-University Freiburg, Institute for Biology I, Germany

³ University Hospital Freiburg, Epilepsy Center, Germany

⁴ Albert-Ludwigs-University Freiburg, Institute for Biology III, Germany

Brain-machine interfaces (BMIs) can be characterized by the approach used to translate brain signals into effector movements. We use a “direct motor” BMI approach where movements of an artificial effector (e.g. movement of an arm prosthesis to the left) are controlled by motor cortical signals that control the equivalent movements of the corresponding body part (e.g. arm movement to the right). This approach has been successfully applied in monkeys and humans by accurately extracting parameters of movement from the spiking activity of multiple single-units. Here we show that the same approach can be realized using brain activity measured directly at the surface of the human cortex (electrocorticogram, ECoG). Three subjects suffering from intractable pharmacoresistant epilepsy voluntarily participated in the study after having given their informed consent (study approved by the Freiburg University Hospital's Ethics Committee). As a part of pre-surgical diagnosis all subjects had 8x8 ECoG grid implants (4 mm electrode contact diameter, 10 mm inter-electrode distance, Ad-Tech Medical Instruments, USA) over the hand and arm motor cortex. Subjects interacted with an experimental paradigm shown on a computer screen. Each trial consisted of a pause phase (1-2 sec) followed by a preparatory phase (1-2 sec) which informed the subject to prepare for executing or imagining a hand/arm movement to the left or right using the hand contralateral to the implantation site. After a delay of 2-3 sec, a go cue was presented and subjects had to perform the movement execution or imagination within the next two seconds. Subsequently, a cursor on the screen was moved according to the movement direction decoded from the subjects' ECoG signals. Closed loop BMI control of movement direction was realized using low-pass filtered (symmetric Savitzky-Golay filter, 2nd order, between 0.25 and 1 sec window length) ECoG signals during movement execution or movement imagination. For movement execution significant BMI control was achieved for all subjects in all 7 sessions with correct directional decoding in 69%-86% of the trials (79% on average across all sessions). Movement imagination was carried out with only one subject where 3 out of 4 sessions showed significant BMI control with correct decoding in 66%-72% of the trials (69% on average). In summary, our results demonstrate the principle feasibility of an online direct motor BMI using ECoG signals. Thus, for a direct motor BMI, ECoG might be used in conjunction or as an alternative to the intra-cortical signals, with possible advantages due to reduced invasiveness.

Acknowledgements

Work supported by BMBF 01GQ0420 to BCCN Freiburg and BMBF GoBio grant 0313891.

Keywords : Computational neuroscience

Conference : Bernstein Conference on Computational Neuroscience, Berlin, Germany, 27 Sep - 1 Oct, 2010.

Presentation Type : Presentation

Topic : Bernstein Conference on Computational Neuroscience

Citation : Milekovic T, Fischer J, Ball T, Schulze-Bonhage A, Aertsen A and Mehring C (2010). An Online Brain-Machine Interface Using Decoding Of Movement Direction From The Human Electrocoorticogram. *Front. Comput. Neurosci. Conference Abstract: Bernstein Conference on Computational Neuroscience*. doi: 10.3389/conf.fncom.2010.51.00028

Received : 20 Sep 2010; Published Online: 23 Sep 2010.

* Correspondence : Dr. Tomislav Milekovic, Albert-Ludwigs-University Freiburg, Bernstein Center for Computational Neuroscience, Freiburg, Germany, milekovic@freiburg.de



Number, reliability and precision of long-distance projections onto neocortical layer 5 pyramidal neurons

Philipp Schnepel^{1, 2}, Martin Nawrot³, Ad Aertsen^{1, 2} and Clemens Boucsein^{1, 2*}

¹ Albert-Ludwig University, Neurobiology and Biophysics, Faculty of Biology, Germany

² Albert-Ludwig University, Bernstein Center Freiburg, Germany

³ Freie Universität Berlin, Neuroinformatics/Theoretical Neuroscience, Institute of Biology, Germany

Current concepts of cortical information processing and most cortical network models largely rest on the assumption that the well-studied properties of local synaptic connections are sufficient to understand the generic properties of cortical networks. This view seems to be justified by the fact that vertical connectivity within local volumes is strong, and connection probability between pairs of neurons in the lateral direction drops dramatically with increasing distance. However, recent neuroanatomical studies (Hellwig 2000; Binzegger et al., 2004; Stepanyants et al., 2009) have consistently suggested that an estimated fraction of 5% of synapses on pyramidal neocortical neurons stem from cells outside the local volume (>300 μm lateral distance). Hence, taking account long-distance horizontal connections might dramatically change the current view on cortical information processing. Physiological characterization of long-distance lateral projections has been hampered by methodological constraints. Due to the drop of connection probability with lateral distance, the success rate for paired recordings in slice preparations is extremely low at distances > 200 μm.

Here, to overcome these problems, we employed photo stimulation in acute cortical slices to characterize parameters of synaptic physiology of long-distance horizontal connections in a range of 200 ~ 1500 μm of lateral distance. We found that, even in slice preparation with its limited amount of preserved projections, the probability of finding connected cells is still considerable at distances up to 2 mm. The average amplitude of EPSCs slightly dropped with distance, while strong connections were still present over long distances. Short and long range connections showed (1) an equally high synaptic reliability of 100% in most tested cells, (2) the same level of amplitude variability, and (3) an equally high temporal precision of <1ms.

Thus, our data provide additional information for the parametrization of long-range connections in neural network models of cortical information processing. Taken together, our measurements suggest that long-distance horizontal connections constitute a non-negligible fraction of synaptic links within the cortical network. While the average strength of these connections slightly drops with increasing distance, they contribute with high reliability and high temporal precision to the single cell input in layer 5.

Acknowledgements

Funded by BMBF grant 01GQ0420 to BCCN Freiburg, the German Research Council (DFG-SFB 780) and the 6th EU-RFP (FACETS).

References

- 1) Stepanyants A, Martinez LM, Ferecskó AS, Kisvárdy ZF (2009) The fractions of short- and long-range connections in the visual cortex. *Proc Natl Acad Sci U S A* 106(9):3555-60
- 2) Hellwig B (2000) A quantitative analysis of the local connectivity between pyramidal neurons in layers 2/3 of the rat visual cortex. *Biol Cybern.* 83(1):1-10
- 3) Binzegger T, Douglas RJ, Martin KA (2004) A quantitative map of the circuit of cat primary visual cortex. *J Neurosci.* 24(39):8441-53

Keywords : connectivity, neural variability, synaptic transmission, photo stimulation

Conference : Bernstein Conference on Computational Neuroscience, Berlin, Germany, 27 Sep - 1 Oct, 2010.

Presentation Type : Presentation

Topic : Bernstein Conference on Computational Neuroscience

Citation : Schnepel P, Nawrot M, Aertsen A and Boucsein C (2010). Number, reliability and precision of long-distance projections onto neocortical layer 5 pyramidal neurons. *Front. Comput. Neurosci. Conference Abstract: Bernstein Conference on Computational Neuroscience.* doi: 10.3389/conf.fncom.2010.51.00110

Received : 09 Sep 2010; Published Online: 23 Sep 2010.

* Correspondence : Dr. Clemens Boucsein, Albert-Ludwig University, Neurobiology and Biophysics, Faculty of Biology, Freiburg, Germany, clemens.boucsein@biol.uni-freiburg.de



Stereotypic spatiotemporal activity patterns during slow-wave activity in the neocortex

Thomas Fucke^{1, 2}, Dymphie Suchanek^{1, 2}, Yamina Seamari³, Martin Nawrot⁴, Ad Aertsen^{1, 2} and Clemens Boucsein

¹ Albert-Ludwig University, Neurobiology and Biophysics, Faculty of Biology, Germany

² Albert-Ludwig University, Bernstein Center Freiburg, Germany

³ University of Malaga, Department of Physiology, Spain

⁴ Freie Universität Berlin, Neuroinformatics/Theoretical Neuroscience, Institute of Biology, Germany

Periodically alternating epochs of vigorous activity and complete silence are a characteristic feature of neocortical networks during certain sleep cycles and deep states of anesthesia. The mechanisms leading to these low frequency (~1Hz) oscillations and their functional role have not yet been fully understood. Evidence from both, experimental and theoretical studies show that slow oscillations can be generated autonomously by neocortical tissue, but become more regular through a thalamo-cortical feedback loop. Hints for a functional role of slow-wave activity come from EEG recordings in humans during sleep, showing that such activity propagates in stereotypic waves over the entire brain. This was interpreted as a possible mechanism for memory consolidation. Here, we used an animal model to investigate such wave propagation on a much smaller scale, within the rat somatosensory cortex. Recordings from multiple extracellular micro-electrodes in combination with one intracellular recording in the anesthetized rat in vivo were utilized to monitor the spread of activity. We found that activity propagation in most animals clearly showed a preferred direction, suggesting that it often originated from a single location in the cortex. In addition, the breakdown of the active state followed a similar pattern with slightly weaker direction preference, but a clear correlation to the direction of activity spread supporting the notion of a wave-like phenomenon, similar to that observed after strong sensory stimulation in primary sensory cortex. Taken together, our findings support the idea that activity waves during slow-wave sleep do not occur spontaneously at random locations within the network, as was suggested previously, but follow preferred synaptic pathways on a small spatial scale.

Acknowledgements

Funded by BMBF grant 01GQ0420 to BCCN Freiburg, the German Research Council (DFG-SFB 780) and the 6th EU-RFP (FACETS).

Keywords : multi-unit recordings, slow-wave sleep, up-down states

Conference : Bernstein Conference on Computational Neuroscience, Berlin, Germany, 27 Sep - 1 Oct, 2010.

Presentation Type : Poster Abstract

Topic : Bernstein Conference on Computational Neuroscience

Citation : Fucke T, Suchanek D, Seamari Y, Nawrot M, Aertsen A and Boucsein C (2010). Stereotypic spatiotemporal activity patterns during slow-wave activity in the rat neocortex. *Front. Comput. Neurosci. Conference Abstract: Bernstein Conference on Computational Neuroscience*. doi: 10.3389/conf.fncom.2010.51.00040

Received : 17 Sep 2010; Published Online: 23 Sep 2010.

* Correspondence : Dr. Clemens Boucsein, Albert-Ludwig University, Neurobiology and Biophysics, Faculty of Biology, Freiburg, Germany, clemens.boucsein@biol.uni-freiburg.de