





Report of the CAMD Summer School 2018 on the

Electronic Structure Theory & Materials Design

Scientific Organizers:

Karsten W. Jacobsen, Department of Physics, DTU Kristian S. Thygesen, Department of Physics, DTU Jakob Schiøtz, Department of Physics, DTU Thomas Olsen, Department of Physics, DTU Tejs Vegge, Department of Energy Conversion and Storage, DTU

Administrative Organizer:

Marianne Ærsøe, Department of Physics, DTU

In brief:

The Psi-k sponsored "CAMD Summer School 2018 Electronic Structure Theory and Materials Design" took place in the week August 12-17, 2018 at Strandhotel Marienlyst in Helsingør, Denmark. Thanks to the more than 100 external attentive summer school students and the 15 very helpful invited lecturers, the school was the nice success that we had hoped for. The school taught PhD students from all over the world the basic and more advanced concepts in modern electronic structure theory including ground state density functional theory (DFT), many-body methods materials informatics and machine learning. Emphasis was put on the methodology applied "on-top" of ab-initio calculations which is essential for the computational design of new functional materials.

Scientific summary:

The primary purpose of this summer school was to teach the students how electronic structure theory can be used for materials design. An introduction to density functional theory (DFT) with particular emphasis on practical methodology and implementation aspects was given. Extensions beyond the standard DFT formalism including time-dependent DFT, spin-orbit coupling, Berry phases, and Many-body perturbation theory were discussed. In addition, a full day was devoted to machine learning and materials informatics. The subjects provided the students with a basic toolbox that will allow them to perform first principles analysis of a large variety of problems in physics and chemistry. For example, quasiparticle excitations in the GW approximation, excitons from the Bethe-Salpeter Equation (BSE), time-dependent density functional theory (TDDFT), correlation energies from the random phase approximation, Berry phases and topological insulators, heterogeneous catalysis and electrochemistry. The students were then taught how to embed electronic structure calculations in a framework that facilitates design of materials with specific properties.

The summer school consisted of lectures by international experts in the field followed by computer exercises giving hands-on-experience with the concepts discussed in the lectures. The computer exercises were based on the electronic structure code GPAW and the Atomic Simulation Environment (ASE). GPAW is based on the projector-augmented wave methodology and can perform computations on real space grids, plane waves or localized atomic orbitals. Besides ground state DFT, GPAW can perform various post-DFT electronic structures calculations such as GW, BSE, and TDDFT – all exemplified by pedagogical exercises. The ASE is a general purpose open source simulation environment that can be used to setup, control, and analyze electronic structure simulations carried out in a variety of electronic structure codes, e.g. including VASP, Octopus, GPAW, Dacapo, AbInit, ASAP, and Siesta. The exercises were supervised by expert users of ASE and GPAW.

During the exercises, the students worked in small groups with the focus on learning to produce publication quality simulations on a small computer-

cluster. All students had to do one introductory exercise, which served to introduce the students to python and ASE. After completing this, the students could choose between five specialized tutorials on photovoltaics, machine learning, magnetism, catalysis or batteries that were all designed specifically for the students at the school.

Invited lecturers and subjects covered:

- Hardy Gross, Max Planck Institute of Microstructure Physics, Germany "Fundamentals of DFT and TDDFT"
- Jens Nørskov, Stanford University, USA "Computational Design in Catalysis"
- Hannes Jonsson, University of Iceland "Rate Theory"
- Bjørk Hammer, Aarhus University, Denmark "Structures and Reactions at Surfaces" and "Machine Learning and Structural Search"
- Jan Rossmeisl, University of Copenhagen, Denmark "Electrochemistry"
- Georg Kresse, University of Vienna, Austria "Many-Body Perturbation Theory"
- Claudia Draxl, Humboldt-Universität Berlin, Germany "Theoretical Spectroscopy"
- Nicola Marzari, EPFL, Switzerland "2D materials"
- Christopher Wolverton, Northwestern University, USA "Machine Learning and Materials Science"
- Anatole von Lilienfeld, University of Basel, Switzerland "Machine Learning and Chemistry"
- Thomas Bligaard, SLAC National Accelerator Laboratory, USA
 "Materials Informatics"
- Yan Sun, Max-Planck-Gesellschaft, Germany "Topological States of Matter"
- Stefano Curtarolo, Duke University, USA "Discovery of Novel Electronic Materials"

- Aron Walsh, Imperial College London, UK "Materials Modelling for Solar Cells: Perovskites and Beyond"
- Kieron Burke, University of California, USA "The Future of DFT"

Lecturers by organizers and subjects covered:

- Jakob Schiøtz, DTU "Electronic structure tools: ASE and GPAW"
- Kristian S. Thygesen, DTU "Excitations in 2D materials"
- Karsten W. Jacobsen, DTU "Machine Learning Basics"
- Thomas Olsen, DTU "Spin-orbit physics"
- Tejs Vegge, DTU "Batteries"

Venue:

The CAMD summer school was held at Marienlyst Strandhotel in Helsingør in the beautiful North Zealand.

Credits:

A diploma which certified that the students had participated and earned 2.5 ECTS points was issued to the participants upon their completion of the summer school.

The participants and their evaluation:

The participants were primarily international PhD-students but there were also quite a few post docs and other students. The participants' background was in physics, chemistry, chemical engineering and materials science.

After the termination of the summer school, the participants were asked to evaluate a number of criteria, and generally we were quite happy with the outcome of the evaluation. In the figures we depict some of the responses of the students. The students seemed to find that the overall scientific and academical organization of the school was quite satisfactory.

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The information received before arriving was sufficient.	0	0	2	19	58
The school was well organized.	0	0	1	13	65
The lectures satisfied my expectations.	1	1	9	34	34
The exercises satisfied my expectations.	2	3	16	36	22
I would recommend the CAMD Summer School to my colleagues.	0	0	5	20	54

We were very happy that the majority of the participants would recommend another CAMD Summer School to their colleagues.

Before the summer school a lot of work was put into making the exercises more structured this year. The participants could choose between 5 subjects for the exercises:

- Batteries
- Catalysis
- Machine Learning
- Magnetism
- Photovoltaics

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The level of the lectures was adequate to my knowledge.	З	2	12	29	33
The number of lectures per day was adequate.	1	0	3	20	55
The topics of the lectures were selected well.	0	2	5	19	53
The plenary room was suitable.	0	1	2	11	65

Since this was the first time the summer school was taking place outside of DTU, we were also very pleased to see, that the participants liked the venue.

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The accommodation was adequate	0	0	0	6	73
The meals were adequate	2	2	4	7	64
l used the spa facilities	8	0	6	3	62

Name Aayush Singh Agnieszka Jamróz Aleksei Ivanov Alessia Di Vito Alexander Genest Alexander Tygesen Alvaro Posada Borbón Amanda Petersen Amin Mirzai Ananth Govind Rajan Anders Riis-Jensen Anjli Patel Ankit Jain Antti Pihlajamäki Arghya Bhowmik Armin Salmasi Artem Samtsevvch Asbjørn Rasmussen August Edwards Guldberg Mikkelsen Axel Forslund Caitlin Casey-Stevens Charlie Ruffman Charlotte Kirk Christian Søndergaard Pedersen Daniele Torelli David Codony Davide Gambino **Delwin Perera** Deniz Yildiz **Dmitry Gulevich** El-Abed Haidar **Emile Durant** Esko Makkonen Estefania Garijo Del Rio Fan Wang Felix Lochner Félix Musil Geoffrey Weal Hao Wan Hassan Aljama Hassan Ouhbi Heine Anton Hansen Henrik Lund Mortensen Herbert Maczko Hongbiao Tao Ivano Eligio Castelli Jack Pedersen Jaclyn Lunger Jacob Wilson Jamoliddin Khanifaev Jens Kildgaard **Jingjing Shao** Jodie Yuwono Johan Tidholm Jorge Diogo Marques Laranjeira Jose Antonio Garrido Torres Joseph Gauthier Juan Maria García Lastra Juan Santiago Cingolani Justin Villard Kai Sellschopp Kangli Wang Karun Kumar Rao Katrine Svane Kirsten Winther

Name of University/Institution/Company Stanford University Faculty of Pysics, University of Warsaw University of Iceland Università degli Studi di Roma Tor Vergata Institute of High Performance Computing, A*STAR Technical University of Denmark Chalmers University of Technology University of Copenhagen Lund university Massachusetts Institute of Technology Technical University of Denmark Stanford University DTU University of Jyväskylä DTU Energy KTH royal institute of technology Skolkovo Institute of Science and Technology DTU DTU KTH Royal Institute of Technology University of Otago University of Otago Stanford University Danmarks Tekniske Universitet DTU Universitat Politèncica de Catalunva Department of Physics, Chemistry and Biology (IFM), Linköping University Technische Universität Darmstadt Villanova University **ITMO University** The University of Sydney University of Liverpool Aalto University Technical University of Denmark Leibniz Institute for Catalysis. V. Max-Planck-Institut für Eisenforschung **EPFL - IMX - COSMO** University of Otago University of Copenhagen Stanford University Department of Chemistry and Biochemistry, University Of Bern DTU Energy Aarhus University, IFA Wroclaw University of Science and Technology University of Alberta **DTU Energy** University of Copenhagen Massachusetts Institute of Technology Imperial College Lodnon Max-Planck Institute for Iron research DTU Energy Freie University Berlin Monash University Linköping University CICECO-Aveiro Institute of Materials Stanford University Stanford University DTU Energy Technische Universität München Ecole Polytechnique Fédérale de Lausanne Hamburg University of Technology Free University of Berlin University of Houston Technical University of Denmark SLAC National Accelerator Laboratory

Country United States Poland Iceland Italv Singapore Denmark Sweden Denmark Sweden United States Denmark United States United States Finland Denmark Sweden Russia Denmark Denmark Sweden New Zealand New Zealand United States Denmark Denmark Spain Sweden Germany United States Russia Australia United Kingdom Finland Denmark Germanv Germany Switzerland New Zealand Denmark United States Switzerland Denmark Denmark Poland Canada Denmark Denmark United States United Kingdom Germany Denmark Germany Australia Sweden Portugal United States United States Denmark Germany Switzerland Germany Germany United States Denmark United States

Name Kris Brown Lauren Walters Leila Ben Mahfoud Lev Martinez Aguilera Lin Chen Luca Vannucci Lucas Cavalcante Mads-Peter Verner Christiansen Malthe Bisbo Marco Bragato Mark Kamper Svendsen Mathias Dankl Megha Anand Michael Statt Mihovil Bosnar Mohammad Bahmani Morten Niklas Gjerding Nan Zhang Narges Atrak Nathalie Vonrüti Paavo Auvinen Paulo André Gonçalves Peng Chen Pierre-Louis Lee Piotr de Silva Raul Flores Rina Ibragimova Robert Sandberg Rubén Soria Martínez Rune Christensen Samantha Hood Sanghoon Lee Sara Kelly Selwyn Hanselman Shashi Bhusan Mishra Simone Manti Sindre Søpstad Spyridon Divanis Steen Lysgaard Stefan Heinen Sten Haastrup Søren Ager Meldgaard Teng Li Thomas Bathelor Thomas Ludwig Thorbjørn Skovhus Thorsten Deilmann Tim Würger **Tugce Kutlusoy** Uday Gajera Unni Engedahl Venkat Kapil Venkata Surva Chaitanva Kolluru Vilhjálmur Ásgeirsson Ville Korpelin Vy Thi Hoang Nguyen Yanbing Zhu Young-Kwang Jung Yun Zhao Zeyuan Tang Zhihong Wei

Stanford University Northwestern Univ Laboratoire Hubert Curien, Université Jean-Monnet, Saint-Etienne Technical University of Denmark Chalmers University of Technology CAMD, Department of Physics, Technical University of Denmark Technical University of Denmark Aarhus University Aarhus University University of Basel DTU EPFL Denmark Technical University Stanford University Ruđer Bošković Institute Bremen Center for Computaional Materials Science **DTU Physics** Leibniz-Institut für Katalyse University of Iceland University of Bern University of Eastern Finland Technical University of Denmark Italian Institute of Technology Scalian DTU Energy Stanford University Aalto University Stanford University University of Strasbourg - CNRS Technical University of Denmark Imperial College London Korea Atomic Energy Research Institute Stanford University Leiden University INDIAN INSTITUTE OF TECHNOLOGY MADRAS Technical University of Denmark University College of Southeast Norway University of Copenhagen DTU Energy Uni Basel CAMD, DTU Aarhus University Leibniz-Institut für Katalyse København Universitet Stanford University Technical University of Denmark CAMD. DTU Helmholtz-Zentrum Geesthacht Copenhagen University The Max-Planck-Institut für Eisenforschung GmbH Chalmers University of Technology EPFL - IMX - COSMO University of Florida University of Iceland University of Jyväskylä DTU Danchip Stanford Yonsei University Leibniz-Institut für Katalyse e. V Aarhus University, Department of Physics and Astronomy Leibniz-Institut für Katalyse e. V.

Name of University/Institution/Company

Country United States United States France Denmark Sweden Denmark Brazil Denmark Denmark Switzerland Denmark Switzerland United States United States Croatia Germany Denmark Germany Iceland Switzerland Finland Denmark Italy France Denmark United States Finland United States France Denmark United Kingdom South Korea United States Netherlands India Denmark Norway Denmark Denmark Switzerland Denmark Denmark Germany Denmark United States Denmark Denmark Germany Denmark Germany Sweden Switzerland United States Iceland Finland Denmark United States South Korea Germany Denmark Germany

Speakers: Anatole von Lilienfeld

University of Basel

Nomo	Nome of University/Institution/Company	Country
	Name or University/Institution/Company	Country
Aron Walsh	Imperial College London	United Kingdom
Bjørk Hammer	Aarnus University/Dept of Physics and Astronomy	Denmark
Christopher Wolverton	Northwestern University	United States
Claudia Draxi	HU Berlin	Germany
Eberhard Gross	MPI of Microstructure Physics	Germany
Georg Kresse	University of Vienna, Faculty of Physics	Austria
Hannes Jonsson	University of Iceland	Iceland
Jan Rossmeisl	KU	Denmark
Jens Kehlet Nørskov	DTU	Denmark
Kieron Burke	UC Irvine	United States
Nicola Marzari	EPFL	Switzerland
Stefano Curtarolo	Duke University	United States
Thomas Bligaard	SLAC	United States
Yan Sun	Max Planck Institute for Chemical Physics of Solids	Germany
Local seniors:		
Jakob Schiøtz	DTU Fysik	Denmark
Karsten W. Jacobsen	DTU	Denmark
Kristian Sommer Thygesen	DTU Physics	Denmark
Teis Vegge	Technical University of Denmark	Denmark
Thomas Olsen	DTU	Denmark
Computing staff:		
Jens Jørgen Mortensen	DTU Physics	Denmark
Mikkel Strange	DTU Physics	Denmark
Minter Orango		Denmark
Administration:		_ .
Marianne Ærsøe	DTU Physics	Denmark

The CAMD Summer School Electronic Structure Theory and Materials Design 2018

Program:

Sunday, August	12:
11:30-13:15	Registration and lunch
13:15-13:30	Welcome
13:30-14:30	Fundamentals of DFT and TDDFT (Hardy Gross)
14:30-15:00	Coffee break and check-in
15:00-16:00	Electronic structure tools: ASE and GPAW (Jakob Schiøtz)
16:00-18:00	Computer exercises
19:00	Dinner

Monday, August 13:

- 07:00-09:30 Breakfast
- 09:30-10:30 Rate Theory (Hannes Jonsson)
- 10:30-11:00 Coffee break
- 11:00-12:00 Computational Design in Catalysis (Jens Nørskov)
- 12:00-13:30 Lunch
- 13:30-14:30 Structures and Reactions at Surfaces (Bjørk Hammer)
- 14:30-15:00 Coffee break
- 15:00-16:00 Electrochemistry (Jan Rossmeisl)
- 16:00-18:00 Computer exercises
- 18:00 Poster session with sandwiches

Tuesday, August 14:

- 07:00-09:30 Breakfast
- 09:30-10:30 Many-Body Perturbation Theory (Georg Kresse)
- 10:30-11:00 Coffee break
- 11:00-12:00 Theoretical Spectroscopy (Claudia Draxl)
- 12:00-13:30 Lunch
- 13:30-14:30 2D materials (Nicola Marzari)
- 14:30-15:00 Coffee break
- 15:00-16:00 Excitations in 2D materials (Kristian S. Thygesen)
- 16:00-18:00 Computer exercises
- 19:00 Dinner

Wednesday, August 15:

- 07:00-09:00 Breakfast
- 09:00-10:00 Machine Learning Basics (Karsten W. Jacobsen)
- 10:00-10:30 Coffee break
- 10:30-11:30 Machine Learning and Materials Science (Christopher Wolverton)
- 11:30-12:30 Lunch
- 12:30-13:30 Machine Learning and Chemistry (Anatole von Lilienfeld)
- 13:30-14:30 Machine Learning and Structural Search (Bjørk Hammer)
- Rest of the day: Excursion and social dinner

Thursday, August 16:	
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- 07:00-09:30 Breakfast
- 09:30-10:30 Spin-orbit physics (Thomas Olsen)
- 10:30-11:00 Coffee break
- 11:00-12:00 Topological States of Matter (Yan Sun)
- 12:00-13:30 Lunch
- 13:30-14:30 Materials Informatics (Thomas Bligaard)
- 14:30-15:00 Coffee break
- 15:00-16:00 Discovery of Novel Electronic Materials (Stefano Curtarolo)
- 16:00-18:00 Computer exercises
- 19:00 Dinner

Friday, August 17:

- 07:00-09:30 Breakfast
- 09:30-10:30 Materials Modelling for Solar Cells: Perovskites and Beyond (Aron Walsh)
- 10:30-11:00 Coffee break
- 11:00-12:00 Batteries (Tejs Vegge)
- 12:00-13:30 Lunch
- 13:30-14:30 The Future of DFT (Kieron Burke)
- 14:30-15:00 Closing remarks and evaluation