# Scientific Report on SNSF project 172710 Numerical methods for stationary and time-dependent multiscale problems

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#### TO DO

## References

- [1] A. ABDULLE, I. ALMUSLIMANI, AND G. VILMART, Optimal explicit stabilized integrator of weak order 1 for stiff and ergodic stochastic differential equations, SIAM/ASA J. Uncertain. Quantif., 6 (2018), pp. 937–964, https://doi.org/10.1137/17M1145859.
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- [13] A. ABDULLE, M. J. GROTE, AND G. ROSILHO DE SOUZA, Stabilized explicit multirate methods for stiff differential equations. arXiv preprint arXiv:2006.00744, 2020.
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- [15] A. ABDULLE, G. A. PAVLIOTIS, AND A. ZANONI, Eigenfunction martingale estimating functions and filtered data for drift estimation of discretely observed multiscale diffusions. arXiv preprint arXiv:2104.10587, 2021.
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- [19] A. Abdulle and G. Rosilho de Souza, Instabilities and order reduction phenomenon of an interpolation based multirate Runge-Kutta-Chebyshev method. arXiv preprint arXiv:2003.03154, 2020.
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- [21] G. Garegnani, Sampling methods for Bayesian inference involving convergent noisy approximations of forward maps. arXiv preprint arXiv:2111.03491, 2021.
- [22] G. Garegnani and A. Zanoni, Robust estimation of effective diffusions from multiscale data. arXiv preprint arXiv:2109.03132, 2021.

# 1 Output Data

## 1.1 Scientific publications

#### Published or accepted

- [1] A. ABDULLE, I. ALMUSLIMANI, AND G. VILMART, Optimal explicit stabilized integrator of weak order 1 for stiff and ergodic stochastic differential equations, SIAM/ASA J. Uncertain. Quantif., 6 (2018), pp. 937–964, https://doi.org/10.1137/17M1145859
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- [9] A. ABDULLE, G. GAREGNANI, AND A. ZANONI, Ensemble Kalman Filter for Multiscale Inverse Problems, Multiscale Model. Simul., 18 (2020), pp. 1565–1594, https://doi.org/ 10.1137/20M1348431
- [10] A. ABDULLE, G. A. PAVLIOTIS, AND G. VILMART, Accelerated convergence to equilibrium and reduced asymptotic variance for Langevin dynamics using Stratonovich perturbations, C. R. Math. Acad. Sci. Paris, 357 (2019), pp. 349-354, https://doi.org/10.1016/j. crma.2019.04.008
- [11] A. ABDULLE AND G. ROSILHO DE SOUZA, A local discontinuous Galerkin gradient discretization method for linear and quasilinear elliptic equations, ESAIM Math. Model. Numer. Anal., 53 (2019), pp. 1269–1303, https://doi.org/10.1051/m2an/2019022

#### **Preprints**

- [1] A. ABDULLE, D. ARJMAND, AND E. PAGANONI, An elliptic local problem with exponential decay of the resonance error for numerical homogenization. arXiv preprint arXiv:2001.06315, 2020
- [2] A. Abdulle, D. Arjmand, and E. Paganoni, Analytical and numerical study of a modified cell problem for the numerical homogenization of multiscale random fields. arXiv preprint arXiv:2007.10828, 2020

- [3] A. Abdulle, L. Gander, and G. Rosilho de Souza, Optimal stabilized explicit integrators for stiff discrete noise stochastic differential equations. arXiv preprint arXiv:2106.09339, 2021
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- [5] A. Abdulle, G. A. Pavliotis, and A. Zanoni, Eigenfunction martingale estimating functions and filtered data for drift estimation of discretely observed multiscale diffusions. arXiv preprint arXiv:2104.10587, 2021
- [6] A. Abdulle and G. Rosilho de Souza, Instabilities and order reduction phenomenon of an interpolation based multirate Runge-Kutta-Chebyshev method. arXiv preprint arXiv:2003.03154, 2020
- [7] A. Abdulle and G. Rosilho de Souza, A posteriori error analysis of a local adaptive discontinuous Galerkin method for convection-diffusion-reaction equations. arXiv preprint arXiv:2004.07148, 2020
- [8] A. Abdulle and G. Rosilho de Souza, Explicit stabilized multirate methods for stiff stochastic differential equations. arXiv preprint arXiv:2010.15193, 2020
- [9] M. CROCI AND G. ROSILHO DE SOUZA, Mixed-precision explicit stabilized Runge-Kutta methods for single- and multi-scale differential equations. arXiv preprint arXiv:2109.12153, 2021
- [10] G. Garegnani, Sampling methods for Bayesian inference involving convergent noisy approximations of forward maps. arXiv preprint arXiv:2111.03491, 2021
- [11] G. Garegnani and A. Zanoni, Robust estimation of effective diffusions from multiscale data. arXiv preprint arXiv:2109.03132, 2021

#### 1.2 Academic events

Giacomo Garegnani has given the following presentations on the topics of the project:

- Workshop presentation: Calibration of probabilistic numerical methods, Dagstuhl Seminar "Probabilistic Numerical Methods From Theory to Implementation", October 2021, Dagstuhl, Germany
- Conference presentation: Random mesh FEM: A probabilistic approach to the FEM, European Finite Element Fair, September 2021, Paris, France
- Seminar presentation: Filtering the data: An alternative to subsampling for drift estimation of multiscale diffusions, RWTH Aachen University, January 2021, Aachen, Germany
- Conference presentation (cancelled due to Covid19): Model misspecification and uncertainty quantification for drift estimation in multiscale diffusion processes, SIAM conference on uncertainty quantification, March 2020, Garching, Germany
- Seminar presentation: A pre-processing technique for asymptotically correct drift estimation in multiscale diffusion processes, Imperial College London, February 2020, London, UK
- Seminar presentation: Bayesian inference of multiscale differential equations, Caltech, August 2019, Pasadena, US
- Seminar presentation: Bayesian inference of multiscale diffusion processes, MATHICSE retreat, June 2019, Champéry, Switzerland

- Summer school presentation: Probabilistic Runge-Kutta methods for uncertainty quantification of numerical errors in geometric integration, FoMICS-DADSi Summer School on Data Assimilation, September 2018, Lugano, Switzerland
- Conference presentation: Uncertainty quantification of numerical errors in geometric integration via random time steps, AIMS Conference on Dynamical Systems, Differential Equations and Applications, July 2018, Taipei, Taiwan
- Seminar presentation: Probabilistic geometric integration of ordinary differential equations, MATHICSE retreat, June 2018, Sainte-Croix, Switzerland
- Conference presentation: Random time steps geometric integrators of ordinary differential equations for uncertainty quantification of numerical errors, Swiss Numerics Day, April 2018, ETH Zürich, Switzerland
- Seminar presentation: Uncertainty quantification of numerical errors in geometric integration via random time steps, Max Planck Institute for Intelligent Systems, March 2018, Tübingen, Germany
- Seminar presentation: Probabilistic Runge-Kutta methods for ODEs: Chaotic problems and geometric properties, MATHICSE retreat, June 2017, Leysin, Switzerland

**Andrea Zanoni** has given the following presentations on the topics of the project:

- Conference presentation (upcoming): Data-driven homogenization of multiscale Langevin dynamics, SIAM Conference on uncertainty quantification, April 2022, Atlanta, US
- Conference presentation: Inference of effective diffusions from multiscale data, Swiss Numerics Day, September 2021, Lausanne, Switzerland
- Conference presentation: Solution of multiscale inverse problems through filtering techniques and numerical homogenization, 14th WCCM & ECCOMAS Congress 2020, January 2021, virtual event

Andrea Di Blasio has given the following presentations on the topics of the project:

- Conference presentation: Model order reduction and numerical homogenization for solving Bayesian multiscale inverse problems, EUROMECH colloquium, August 2018, Bad-Herrenalb, Germany
- Seminar presentation: Numerical methods for solving Bayesian multiscale inverse problems, MATHICSE retreat, June 2018, Sainte-Croix, Switzerland
- Conference presentation: Numerical homogenization and model order reduction for solving linear elasticity problems in perforated domains, ECCM ECFD 2018, June 2018, Glasgow, UK
- Conference presentation: Model order reduction and Bayesian techniques for multiscale inverse problems, COMPLAS 2017, September 2017, Barcelona, Spain
- Conference presentation: Numerical homogenization and Bayesian techniques for multiscale inverse problems, EQUADIFF 2017, July 2017, Bratislava, Slovakia
- Seminar presentation: Using numerical homogenization for solving elliptic multiscale inverse problems, MATHICSE retreat, June 2017, Leysin, Switzerland
- Conference presentation: Solving elliptic multiscale inverse problems using Bayesian techniques and numerical homogenization, Swiss Numerics Day, April 2017, Basel, Switzerland
- Seminar presentation: A reduced basis method for multiscale inverse problems, MATH-ICSE retreat, June 2016, Leysin, Switzerland

• Conference poster: A reduced basis method for multiscale inverse problems, Swiss Numerics Day, April 2016, Fribourg, Switzerland

Giacomo Rosilho de Souza has given the following presentations on the topics of the project:

- Conference presentation: Multirate stabilized explicit methods based on a modified equation for problems with multiple scales, SIAM conference on computational science and engineering (CSE21), March 2021, virtual event
- Workshop presentation: Multirate stabilized explicit methods for deterministic and stochastic differential equations without clear-cut scale separation, CECAM workshop "Multiscale simulations of soft matter: New method developments and mathematical foundations", September 2020, Mainz, Germany, virtual event
- Seminar presentation: Multirate explicit stabilized integrators for stiff differential equations, Universität Basel, November 2019, Basel, Switzerland
- Conference presentation: Stabilized explicit multirate methods for ordinary and stochastic differential equations with multiple scales, SciCADE International Conference on Scientific Computation and Differential Equations, July 2019, Innsbruck, Austria
- Seminar presentation: Multirate explicit stabilized integrators for stiff differential equations, MATHICSE seminar, June 2019, Champéry, Switzerland
- Seminar presentation: A local discontinuous Galerkin FEM for linear and quasilinear elliptic equations, MATHICSE seminar, June 2018, Sainte-Croix, Switzerland
- Conference presentation: A priori and a posteriori analysis of a local scheme for elliptic equations, Swiss Numerics Day, April 2018, Zürich, Switzerland
- Seminar presentation: Predictor corrector local time stepping scheme for parabolic equations, MATHICSE seminar, June 2017, Leysin, Switzerland
- Seminar presentation: Two local time stepping techniques for parabolic equations, MATHICSE seminar, June 2016, Leysin, Switzerland

Assyr Abdulle has given the following presentations on the topics of the project:

- Workshop presentation: Stabilized explicit multirate methods for ordinary and stochastic differential equations with multiple scales, Workshop on multiscale methods for deterministic and stochastic dynamics, January 2020, Geneva, Switzerland
- Plenary conference presentation: title?, WAVES 2019,

#### 1.3 Knowledge transfer events

Giacomo Garegnani participated in the following knowledge transfer events:

- Summer school: Dobbiaco summer school on Probabilistic Numerics, June 2017, Dobbiaco, Italy
- Workshop: Workshop on probabilistic numerical methods, Alan Turing Institute, April 2018, London, UK
- Co-Supervision of Master Projects:
  - Andrea Zanoni, Ensemble Kalman filter for multiscale inverse problems, EPFL, 2019 co-supervised with Assyr Abdulle and Sandro Salsa (Politecnico di Milano)
  - Aleksa Stanković, Probabilistic methods for differential equations: adaptivity and Bayesian inverse problems, EPFL, 2018 – co-supervised with Assyr Abdulle
- Co-Supervision of Semester Projects:

- Daniele Hamm, Numerical study of an iterative filtering method for drift estimation of multiscale diffusions, EPFL, 2021 – co-supervised with Assyr Abdulle
- Anne-Sophie Van De Velde, Parameter estimation in multiscale Langevin dynamics with particle filters and Monte Carlo methods, EPFL, 2020 co-supervised with Assyr Abdulle
- Wojciech Reise, Probabilistic solvers for ordinary differential equations, EPFL,
   2019 co-supervised with Assyr Abdulle

Giacomo Rosilho de Souza participated in the following knowledge transfer events:

## • Co-Supervision of Master Projects:

- Lia Gander, Optimized Chebyshev methods for discrete stochastic simulations,
   EPFL, 2019 co-supervised with Assyr Abdulle
- Tristan Chanay, Optimal explicit stabilized method for jump-diffusion processes,
   EPFL, 2021 co-supervised with Assyr Abdulle

#### 1.4 Collaboration

The following national and international collaborations took place:

- Prof. Grigorios A. Pavliotis, Department of Mathematics, Imperial College London, London, UK; including:
  - scientific visit of Prof. Grigorios A. Pavliotis at EPFL (March 2019)
  - scientific visit of Giacomo Garegnani at Imperial College London (3.2.2020-7.2.2020)
  - planned scientific visit of Andrea Zanoni at Imperial College London (14.02.2022-18.03.2022)
- Prof. Andrew M. Stuart, Department of Computing and Mathematical Sciences, Caltech, Pasadena, US; including a scientific visit of Giacomo Garegnani at Caltech (19.08.2019-20-09-2019)
- Prof. Marcus J. Grote, Departement Mathematik und Informatik, Universität Basel, Basel, Switzerland
- MER Gilles Vilmart, Section de Mathématiques, Université de Geneve, Geneva, Switzerland

#### 1.5 Awards

- Giacomo Rosilho de Souza won the John Butcher prize in numerical analysis for the talk *Multirate explicit stabilized integrators for stiff differential equations* that he gave at the SciCADE conference, held in July 2019, Innsbruck, Austria
- Giacomo Garegnani won a SIAM travel award to join the SIAM conference on uncertainty quantification, held in March 2020, Garching, Germany (cancelled due to Covid19)