Redouane Lguensat

IRD Research Engineer / Statistician

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Machine Learning for Climate modeling

Research Interests

Machine Learning, Computer Vision, Numerical Modeling, Data Assimilation, Climate Change Impacts

Current Position

Since Dec IRD Research Engineer / Statistician,

2021 ESPRI-MOD team at IPSL / Sorbonne Université

Bias correction and downscaling of climate model simulations for climate change impact studies, with a focus on developing countries

PhD Thesis (10/2014 - 10/2017)

Topic Learning from Ocean Remote Sensing data: from Analog methods to Deep Learning

Institution IMT Atlantique (ex Télécom Bretagne) / Université Bretagne Loire

Supervisor Prof. Ronan Fablet

Committee

- Prof. Sylvie Thiria Sorbonne Université (Chair)
- o Prof. Antonio Turiel Institut de Ciencies del Mar, Spain (Reviewer)
- Prof. Marc Bocquet Ecole des Ponts- Paris Tech (Reviewer)
- O Dr. Bertrand Chapron Ifremer
- o Dr. Pierre Ailliot Université de Bretagne Occidentale
- Dr. Clément Ubelmann CLS

Professional Record

- Mar 2020 **Machine Learning for the tuning of climate models** Make Our Planet Great Again Sep 2021 funded postdoc, LSCE-IPSL/LOECAN-IPSL, Sorbonne Université, Paris, France Numerical Models, Surrogate modeling, climate modeling
- Dec 2019 **Separation of wave/eddy processes from SSH measurements** *CNRS Research*Feb 2020 *Engineer MEOM team; IGE; Grenoble Alpes University*, Grenoble, France
 Numerical Models, Deep Learning, Computational physics
- Dec 2017 Inversion of SWOT mission data using data-driven methods CNES funded Postdoc Nov 2019 researcher - MEOM team; IGE; Grenoble Alpes University, Grenoble, France Numerical Models, Deep Learning, Computational physics
- Nov 2014 Data-driven interpolation of geophysical dynamics using analog methods *PhD* Oct 2017 student LabSTICC; IMT Atlantique; Bretagne-Loire University, Brest, France Stochastic filtering, Analog methods, Data Assimilation, Deep Learning

- Apr May Sea Altimetry Mapping using Analog Data Assimilation Visiting PhD student 2016 Ocean University of China MIT lab, Qingdao, China Analog Hidden Markov Models, Sea Level Anomalies, Multi-Scale Reconstruction.
- Avr Sep Solving nonlinear non-convex inverse problems under sparsity constraints. Re-2014 search intern - CEA Saclay - Cosmostat team, Saclay, France Convex/non-convex optimization, Sparsity, Greedy algorithms, Proximal algorithms
- Jul Aug Study of electric vehicles charging strategies and their impact on the smart grid 2013 Research intern IRISA OCIF team, Rennes, France Smart grid, Game theory, Reinforcement Learning.

Awards and Grants

- Nvidia Graphics Processing Unit (GPU) card grant through the Nvidia Developer GPU grant program
- CNES Postdoctoral grant (2yrs) to conduct research at IGE Grenoble
- EURASIP Ranked second at the "3 min thesis" competition of EUSIPCO 2016 Budapest, submitted video can be seen here https://youtu.be/bp6mOXf7BJY
- "Norman Best Student Poster at IEEE/MTS OCEANS'16 Conference in Shanghai, China Miller's Prize"
- "Morocco Delivered by the "Moroccan Scientific Community", a science communication initiative Science run by a team of volunteers covering different areas of expertise. The prize was given for Award" 2016 the category "3 min thesis"

Education

- 2014–2017 **Doctor of Philosophy (PhD) in Computer Vision.** *IMT Atlantique*, Brest, France www.imt-atlantique.fr (formerly known as Telecom Bretagne) / Thesis supervisor: Prof. Ronan Fablet
- 2011–2014 Engineer's degree, major: Image Processing and Remote Sensing. *IMT Atlantique*, Brest, France
- 2013–2014 Research master degree "Sciences, Technologies, Santé", SISEA, major: Image Processing. *Université de Rennes I*, Rennes, France
- 2011–2012 Bachelor's degree: Mathematics. Université de Bretagne Occidentale, Brest, France
- 2009–2011 **Preparatory classes for French "Grandes Ecoles"** *CPGE Mohamed V*, Casablanca, Morocco, *MPSI/MP**

■ Publications (H-index: 9; >300 citations; source Google Scholar)

Review paper

M. Sonnewald, R. Lguensat, Jones, D. C., Dueben, P. D., Brajard, J., and Balaji, V. (2021). "Bridging observation, theory and numerical simulation of the ocean using Machine Learning", *Environmental Research Letters* ((JCR, IF 6.09))

Journal papers

 M. Sonnewald and R. Lguensat. "Revealing mechanisms of change in the Atlantic Meridional Overturning Circulation under global heating". Journal of Advances in Modeling

- Earth Systems (JAMES), 2021 ((JCR, IF 6.66)).
- Y. Yang, Kin-Man Lam, X. Sun, J. Dong, R. Lguensat. "An Efficient Algorithm for Ocean-Front Evolution Trend Recognition". Remote Sensing, 2021. ((JCR, IF 4.8)).
- H. Frezat, G. Balarac, J. Le Sommer, R. Fablet, R. Lguensat. "Physical invariance in neural networks for subgrid-scale scalar flux modeling" *Physical Review Fluids*. ((JCR, IF 2.51))
- X. Sun, M. Zhang, J. Dong, R. Lguensat, Y. Yang, X. Lu. "A Deep Framework for Eddy Detection and Tracking From Satellite Sea Surface Height Data" *IEEE Transactions in Geoscience and Remote Sensing*, 2020. ((JCR, IF 5.85)).
- R. Lguensat, Viet, P. H., Sun, M., Chen, G., Fenglin, T., Chapron, B., and Fablet, R. "Data-driven Interpolation of Sea Level Anomalies using Analog Data Assimilation." Remote Sensing, 2019. ((JCR, IF 4.50))
- R. Lguensat, P. Tandeo, P. Aillot, M. Pulido and R. Fablet, "The Analog Data Assimilation" Monthly Weather Review, 2017. ((JCR, IF 3.43))
- R. Fablet, P. Viet, R. Lguensat, P-H Horrein and B. Chapron, "Spatio-Temporal Interpolation of Cloudy SST Fields Using Conditional Analog Data Assimilation" Remote Sensing, 2018. ((JCR, IF 4.50))
- R. Fablet, P. Viet, and R. Lguensat. "Data-driven Methods for Spatio-Temporal Interpolation of Sea Surface Temperature Images". *IEEE Transactions on Computational Imaging*, 2017. ((JCR, IF 4.01))
- Y. Yang, J. Dong, X. Sun, R. Lguensat, M. Jian, X. Wang. "Ocean Front Detection from Instant Remote Sensing SST Images". *IEEE Geoscience and Remote Sensing Letters*, 2016 ((JCR, IF 3.83))

Conference papers

- H. Frezat, J. Le Sommer, R. Fablet, G. Balarac, R. Lguensat "A posteriori learning of quasi-geostrophic turbulence parametrization: an experiment on integration steps". Machine Learning and the Physical Sciences workshop at NeurIPS 2021.
- M. Sonnewald, R. Lguensat, A. Radhakrishnan, Z. Sayibou "Revealing the impact of global warming on climate modes using transparent machine learning and a suite of climate models". Spotlight talk at "Tackling Climate Change with Machine Learning" workshop at ICML 2021.
- R. Lguensat, R. Fablet, J. Le Sommer, S. Metref, E. Cosme. K. Ouenniche, L. Drumetz, J. Gula. "Filtering Internal Tides From Wide-Swath Altimeter Data Using Convolutional Neural Networks". IGARSS 2020: IEEE International Conference on Geoscience and Remote Sensing, Hawai, USA.
- R. Lguensat, W. Jones, A. Charantonis, D. Watson-Parris. "The 2020 Climate Informatics Hackathon: Generating Nighttime Satellite Imagery from Infrared Observations". Climate Informatics Conference 2020, Oxford, UK.
- Harder et al. "NightVision: Generating Nighttime Satellite Imagery from Infra-Red Observations" Climate Change Al workshop, NeurIPS 2020. Vancouver, Canada.
- R. Lguensat, J. Le Sommer, R. Fablet, S. Metref, E. Cosme. "Learning Generalized Quasi-Geostrophic Models Using Deep Neural Numerical Models" Machine Learning and the Physical Sciences workshop, NeurIPS 2019. Vancouver, Canada.
- H. Chergui, K. Tourki, R. Lguensat, M. Benjillali, C. Verikoukis, M. Debbah, "Classification Algorithms for Semi-Blind Uplink/Downlink Decoupling in sub-6 GHz/mmWave 5G Networks." IWCMC19: International Wireless Communications and Mobile Computing Conference. Tangier, Morocco.
- R. Lguensat, M. Sun, R. Fablet, E. Mason, P. Tandeo, G. Chen. "EddyNet: A deep neural network for the detection and classification of ocean eddies" IGARSS 2018: IEEE

- International Conference on Geoscience and Remote Sensing. Valencia, Spain.
- R. Fablet, P. Viet, and R. Lguensat. "Data-driven assimilation of irregularly-sampled image time series" ICIP 2017: IEEE International Conference on Image Processing, Beijing, China.
- R. Lguensat, M. Sun, G. Chen, T. Lin, R. Fablet, Spatio-Temporal Interpolation of Altimeter-Derived SSH Fields Using Analog Data Assimilation: A Case-Study In The South China Sea. IGARSS 2017: IEEE International Geoscience and Remote Sensing Symposium, Fort Worth, Texas, USA.
- R. Lguensat, R. Fablet, P. Ailliot and P. Tandeo, An Exemplar-based HMM framework for nonlinear state-space models. EUSIPCO 2016: IEEE European Signal Processing Conference, Budapest, Hungary.
- R. Lguensat, P. Tandeo, P. Ailliot, B. Chaperon and R. Fablet, Using archived datasets for missing data interpolation in ocean remote sensing observation series, MTS/IEEE OCEANS'16, Shanghai, China.
- R. Fablet, P. Viet, R. Lguensat and B. Chapron, Exploiting ocean observation and simulation big data to improve satellite-derived geophysical products: Analog strategies. BiDS'17: Big Data from Space Conference. Toulouse, France.
- P. Tandeo, P. Ailliot, B. Chapron, **R. Lguensat** and R. Fablet, The analog data assimilation: application to 20 years of altimetric data, Climate Informatics 2015, Boulder, Colorado.
- **R. Lguensat**, P. Tandeo, R. Fablet and P. Ailliot, Non-parametric Ensemble Kalman methods for the inpainting of noisy dynamic textures. ICIP 2015: IEEE International Conference on Image Processing, Quebec City, Canada.
- R. Lguensat, P. Tandeo, R. Fablet and R. Garello, Spatio-temporal interpolation of Sea Surface Temperature using high resolution remote sensing data, OCEANS'14, St. John's, Canada.
- S. Dimitrov, R. Lguensat, Reinforcement Learning Based Algorithm for the Maximization of EV Charging Station Revenue, Mathematics and Computers in Sciences and Industry (MCSI 2014), Varna, Bulgaria.

PhD thesis

• **R. Lguensat**, Learning from Ocean Remote Sensing Data. PhD dissertation, IMT Atlantique/Univ. Bretagne Loire, 2017.

Master thesis

• **R. Lguensat**, Nonlinear optimization under sparsity constraints: Algorithms for solving nonlinear inverse problems. Master SISEA, Universite de Rennes I, 2014.

Technical Reports

• S. Rjiba, **R. Lguensat**, E. Mason, R. Fablet and J. Le Sommer. "Convolutional Neural Networks for the Segmentation of Oceanic Eddies from Altimetric Maps", 2018.

Invited conferences and workshop talks

- Virtual seminar: "History Matching for the tuning of climate models", French-German Make Our Planet Great Again webinar series, Jan 2022.
- Virtual seminar: "History Matching for the tuning of climate models", AI4ES seminars, Barcelona Computing Center, Feb 2021.
- o Invited talk: "Physical Oceanography meets Deep Learning"; Data Science for the future, a workshop

- of Global Science Week 2019, Grenoble, France.
- \circ Talk on "Hybrid ocean numerical models: Physics + Deep Learning" at Al4Climate seminar, LOCEAN lab, March 2019, Paris, France.
- Talk on "Quasi-geostrophy driven Deep learning" at the LEFE/MANU AI & Ocean Atmosphere workshop, February 2019, Rennes, France.
- Talk on "EddyNet: a deep neural network for the detection and classification of oceanic eddies" at Gdr-ISIS/CNES TSI joint meeting, October 2018, Paris, France.
- Talk on "Delving Deep in the ocean with Deep Learning" at Grenoble Data Club, March 2018, Grenoble, France.
- Talk on "Analog Data Assimilation" at Stochastic Weather Generators (SWGEN), 17 May 2016, Vannes, France.
- Talk on the use of historical datasets in geophysics at a joint Seminar between the MIT Lab and Vision Lab of Ocean University of China, 19 April 2016, Qingdao, China.

Teaching/Supervision

French "Qualification MdC" 2018, Section 61

- o (2021) ESIEA: Data Analysis and Estimation theory, Probability and Statistics
- (2020-2022) Master Data Engineering EHTP (Morocco): 4h introduction to deep neural networks + 1h30 tutorial. Materials can be found here: https://github.com/redouanelg/TeachingMaterials/tree/master/EHTP_DataEng
- o (2015-2016) IMT Atlantique: 64h of supervised work/exercise class on Statistics, Probability, Digital communication theory, Image and signal processing.
- Supervision of several Master students:
 - IMT Atlantique: Hamza Ameur (2015), Mael Bompais (2016), Phi Hyunh Viet (2016), Mohamed Fannane (2017), Saifeddine Rjiba (2018)
 - Univ Grenoble Alpes: Audrey Monsimer (2019), Mickael Lalande (2019)
 - LOCEAN-IPSL: Homer Durand (2021)
 - EHTP Morocco: Rania Souri et Nabila Lasri (2021)

Spoken languages

Arabic-Amazigh Native speaker
English Fluent

French Fluent Chinese A2 level

Participation to conference committees and reviewing activities.

Workshop organisation

- Co-convener at EGU22. Session: "Machine learning for Earth System modelling"
- Paper Track Chair at MoroccoAl 2021 conference. https://morocco.ai/conf21
- Co-convener at vEGU21. Session: "Machine learning for Earth System modelling"
- **Co-convener** at AGU'2020 fall meeting. Session: "Innovation and Exploration in Observed and Model Oceanographic Data Using Interpretable Machine Learning"
- Data Challenge chair at Climate Informatics'2020 https://ci2020.web.ox.ac. uk/organizing-committee
- Co-convener at EGU'20. Session: "Machine learning for Earth System modelling"
- Data Challenge chair at Climate Informatics'19 https://sites.google.com/ view/climateinformatics2019
- **General chair** of the *IndabaXMorocco* 2019, a scientific workshop for Artificial Intelligence in Morocco https://indabaXMorocco.github.io.
- Member of the organization committee of Data Science & Environment 2017: IMT Atlantique, international workshop, http://conferences.telecom-bretagne.eu/ dse2017/committees/
- Organizer of PhD students day 2015: IMT Atlantique, Signal & Communications department, http://conferences.telecom-bretagne.eu/jdsc15

Journal Club

Organizer of the Al4Climate journal club since 2020

Reviewing activities

- Journals: Journal of Advances in Modeling Earth Systems (JAMES), Geophysical Research Letters, IEEE JSTARS, Proceedings A, Remote Sensing of the Environment, Journal of Atmospheric and Oceanic Technology, Mathematical Problems in Engineering, IEEE Transactions on Geoscience and Remote Sensing, Earth Space Science, Frontiers in Marine Science, etc.
- Conferences: Earthvision 2021, ClimateChangeAl workshop 2021, MoroccoAl 2021, Climate Informatics'20/'19, Al4EarthScience 2020, IndabaXMorocco'19, etc.