

Ruslan Shaydulin

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Google Scholar: <https://scholar.google.com/citations?user=PxOuGGcAAAAJ>

Profile

An expert in quantum information science. My research focuses on applying quantum computers to problems in optimization and machine learning. I have extensive experience in all aspects of designing and implementing quantum and hybrid quantum-classical algorithms from theoretical analysis to error mitigation.

Work Experience

Vice President, Applied Research Lead, JPMorgan Chase & Co.

Spring 2022 - Present

- Quantum algorithms researcher at the Global Technology Applied Research center

Maria Goeppert Mayer fellow – Argonne Scholar, Argonne National Laboratory

Fall 2020 - Spring 2022

- Working on quantum optimization and quantum machine learning with focus on DOE applications
- Recipient of prestigious and selective postdoctoral fellowship ([< 5 awarded annually](#))

Research Intern, IBM Research – Quantum

Summer 2020

- Developed and implemented a novel approach for Clifford circuit optimization in collaboration with Sergey Braviy, Dmitri Maslov and Shaohan Hu ([arXiv:2105.02291](https://arxiv.org/abs/2105.02291), patent application [US20220129411A1](https://patents.google.com/patent/US20220129411A1))
- Selected as one of four interns to be [highlighted in a promotional video](#) on the basis of performance

Intern, Quantum Artificial Intelligence Lab (QuAIL)

Spring 2020

NASA Ames Research Center (KBR)

- Developed novel analysis connecting the symmetries in problem instance structure to the performance of Quantum Approximate Optimization Algorithm in collaboration with Stuart Hadfield and Tad Hogg ([arXiv:2012.04713](https://arxiv.org/abs/2012.04713))
- Performed extensive numerical simulations using HPC resources

Research Aide, Argonne National Laboratory

Summer 2018, 2019

- Developed quantum-accelerated frameworks for network community detection and graph partitioning under the supervision of Yuri Alexeev
 - Co-authored 6 papers on quantum optimization and machine learning (5 first author)
 - Contributed to multiple proposals
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Education

Clemson University, SC

Summer 2020

PhD in Computer Science, advisor: Ilya Safro

Master of Science in Computer Science en route to PhD

Fall 2019

Research in algorithms, high performance computing, big data analysis and quantum computing

Relevant coursework: Design & Analysis of Algorithms, Data Mining, Distributed & Cluster Computing, Parallel Architecture, Network Science

Moscow Institute of Physics and Technology

Summer 2016

Department of Control and Applied Math,

Bachelor of Science in Applied Mathematics and Physics

Minor: Computer Science and Data Analysis

Peer-reviewed Publications

Alvin Gonzales, **Ruslan Shaydulin**, Zain Saleem, Martin Suchara. Quantum Error Mitigation by Pauli Check Sandwiching. *Sci Rep* 13, 2122 (2023). DOI: [10.1038/s41598-023-28109-x](https://doi.org/10.1038/s41598-023-28109-x)

Ruslan Shaydulin*, Phillip C. Lotshaw*, Jeffrey Larson, James Ostrowski, Travis S. Humble. Parameter Transfer for Quantum Approximate Optimization of Weighted MaxCut. *ACM Transactions on Quantum Computing*
DOI: [10.1145/3584706](https://doi.org/10.1145/3584706)

Tianyi Hao, **Ruslan Shaydulin**, Marco Pistoia, Jeffrey Larson. Exploiting In-Constraint Energy in Constrained Variational Quantum Optimization. In *Proceedings of the Third International Workshop on Quantum Computing Software (in conjunction with Supercomputing '22)*, 2022 (to appear). Preprint: [arXiv:2211.07016](https://arxiv.org/abs/2211.07016)

Kaiyan Shi, Rebekah Herrman, **Ruslan Shaydulin**, Shouvanik Chakrabarti, Marco Pistoia, Jeffrey Larson. Multi-Angle QAOA Does Not Always Need All Its Angles. *ACM/IEEE Workshop on Quantum Computing (in conjunction with The Seventh ACM/IEEE Symposium on Edge Computing)* (to appear). Preprint: [arXiv:2209.11839](https://arxiv.org/abs/2209.11839)

Pradeep Niroula*, **Ruslan Shaydulin***, Romina Yalovetzky*, Pierre Minssen, Dylan Herman, Shaohan Hu, Marco Pistoia. Constrained Quantum Optimization for Extractive Summarization on a Trapped-ion Quantum Computer. *Scientific Reports* 12, 17171 (2022). DOI: [10.1038/s41598-022-20853-w](https://doi.org/10.1038/s41598-022-20853-w)

Ruslan Shaydulin, Stefan Wild. Importance of Kernel Bandwidth in Quantum Machine Learning. *Phys. Rev. A* 106, 042407 (2022). DOI: [10.1103/PhysRevA.106.042407](https://doi.org/10.1103/PhysRevA.106.042407)

Xiaoyuan Liu, **Ruslan Shaydulin**, Ilya Safo. Quantum Approximate Optimization Algorithm with Sparsified Phase Operator. 2022 *IEEE International Conference on Quantum Computing and Engineering (QCE)*, 2022
Preprint: [arXiv:2205.00118](https://arxiv.org/abs/2205.00118)

Ashish Kakkar, Jeffrey Larson, Alexey Galda, **Ruslan Shaydulin**. Characterizing Error Mitigation by Symmetry Verification in QAOA. 2022 *IEEE International Conference on Quantum Computing and Engineering (QCE)*, 2022
Preprint: [arXiv:2204.05852](https://arxiv.org/abs/2204.05852)

Xiaoyuan Liu, Anthony Angone, **Ruslan Shaydulin**, Ilya Safo, Yuri Alexeev, Lukasz Cincio. Layer VQE: A Variational Approach for Combinatorial Optimization on Noisy Quantum Computers. *IEEE Transactions on Quantum Engineering*. DOI: [10.1109/TQE.2021.3140190](https://doi.org/10.1109/TQE.2021.3140190)

Sergey Bravyi, **Ruslan Shaydulin**, Shaohan Hu, Dmitri Maslov. Clifford Circuit Optimization with Templates and Symbolic Pauli Gates. *Quantum* 5, 580, 2021. DOI: [10.22331/q-2021-11-16-580](https://doi.org/10.22331/q-2021-11-16-580)

Ruslan Shaydulin, Stuart Hadfield, Tad Hogg, Ilya Safo. Classical symmetries and the Quantum Approximate Optimization Algorithm. *Quantum Inf Process* 20, 359, 2021. DOI: [10.1007/s11128-021-03298-4](https://doi.org/10.1007/s11128-021-03298-4)

Ruslan Shaydulin, Kunal Marwaha, Jonathan Wurtz, Phillip C. Lotshaw. QAOAKit: A Toolkit for Reproducible Study, Application, and Verification of the QAOA. In *Proceedings of the 2nd International Workshop on Quantum Computing Software (in conjunction with Supercomputing '21)*, 2021. DOI: [10.1109/QCS54837.2021.00011](https://doi.org/10.1109/QCS54837.2021.00011)

Ruslan Shaydulin, Alexey Galda. Error Mitigation for Deep Quantum Optimization Circuits by Leveraging Problem Symmetries. 2021 *IEEE International Conference on Quantum Computing and Engineering (QCE)*, 2021. DOI: [10.1109/QCE52317.2021.00046](https://doi.org/10.1109/QCE52317.2021.00046)

Ruslan Shaydulin, Stefan M. Wild. Exploiting Symmetry Reduces the Cost of Training QAOA. *IEEE Transactions on Quantum Engineering*, 2021 DOI: [10.1109/TQE.2021.3066275](https://doi.org/10.1109/TQE.2021.3066275)

Zirou Qiu, Ruslan Shaydulin, Xiaoyuan Liu, Yuri Alexeev, Christopher S. Henry, Ilya Safro. ELRUNA: Elimination Rule-based Network Alignment. *ACM Journal of Experimental Algorithmics*, 2021. DOI: [10.1145/3450703](https://doi.org/10.1145/3450703)

Hayato Ushijima-Mwesigwa*, Ruslan Shaydulin*, Christian F. A. Negre, Susan Mniszewski, Yuri Alexeev, Ilya Safro. Multilevel Combinatorial Optimization Across Quantum Architectures. *ACM Transactions on Quantum Computing*, 2020. DOI: [10.1145/3425607](https://doi.org/10.1145/3425607)

Justin Sybrandt, Ruslan Shaydulin, Ilya Safro. Hypergraph Partitioning With Embeddings. In *IEEE Transactions on Knowledge and Data Engineering*, 2020. DOI: [10.1109/TKDE.2020.3017120](https://doi.org/10.1109/TKDE.2020.3017120)

Ruslan Shaydulin, Caleb Thomas, Paige Rodeghero. Making Quantum Computing Open: Lessons from Open-Source Projects. In *Proceedings of First International Workshop on Quantum Software Engineering (Q-SE 2020)* (co-located with ICSEW 2020). DOI: [10.1145/3387940.3391471](https://doi.org/10.1145/3387940.3391471)

Sami Khairy, Ruslan Shaydulin, Lukasz Cincio, Yuri Alexeev, Prasanna Balaprakash. Learning to Optimize Variational Quantum Circuits to Solve Combinatorial Problems. In *Proceedings of Thirty-Fourth AAAI Conference on Artificial Intelligence (AAAI-20)*, 2020. **Acceptance rate: 20.6%**
DOI: [10.1609/aaai.v34i03.5616](https://doi.org/10.1609/aaai.v34i03.5616)

Sami Khairy, Ruslan Shaydulin, Lukasz Cincio, Yuri Alexeev, Prasanna Balaprakash. Reinforcement-Learning-Based Variational Quantum Circuits Optimization for Combinatorial Problems. In *Proceedings of the Machine Learning and the Physical Sciences workshop at Conference on Neural Information Processing Systems (NeurIPS 2019)*, 2019. ([link](#))
Preprint: [arXiv:1911.04574](https://arxiv.org/abs/1911.04574)

Ruslan Shaydulin, Yuri Alexeev. Evaluating Quantum Approximate Optimization Algorithm: A Case Study. In *Proceedings of the 2nd International Workshop on Quantum Computing for Sustainable Computing (QCSC 2019)* (in conjunction with 10th International Green and Sustainable Computing Conference (IGSC 2019)), 2019
DOI: [10.1109/IGSC48788.2019.8957201](https://doi.org/10.1109/IGSC48788.2019.8957201)

Sami Khairy, Ruslan Shaydulin, Lukasz Cincio, Yuri Alexeev, Prasanna Balaprakash. Reinforcement Learning for Quantum Approximate Optimization. *Research Poster, Supercomputing '19*, 2019 ([available in Proceedings](#))

Ruslan Shaydulin, Ilya Safro, and Jeffrey Larson. Multistart Methods for Quantum Approximate Optimization. In *Proceedings of 2019 IEEE High Performance Extreme Computing Conference (HPEC)*, 2019
Best Student Paper (of ~50 student papers). DOI: [10.1109/HPEC.2019.8916288](https://doi.org/10.1109/HPEC.2019.8916288)

Ruslan Shaydulin, Hayato Ushijima-Mwesigwa, Christian F.A. Negre, Ilya Safro, Susan M Mniszewski, and Yuri Alexeev. A Hybrid Approach for Solving Optimization Problems on Small Quantum Computers. *Computer*, 52(6):18-26, 2019. Cover Feature. DOI: [10.1109/MC.2019.2908942](https://doi.org/10.1109/MC.2019.2908942)

Ruslan Shaydulin, Hayato Ushijima-Mwesigwa, Ilya Safro, Susan Mniszewski, and Yuri Alexeev. Network Community Detection on Small Quantum Computers. *Advanced Quantum Technologies*, 2(9):1900029, 2019. DOI: [10.1002/qute.201900029](https://doi.org/10.1002/qute.201900029)

Ruslan Shaydulin, Hayato Ushijima-Mwesigwa, Ilya Safro, Susan Mniszewski, and Yuri Alexeev. Community Detection Across Emerging Quantum Architectures. In *Proceedings of the 3rd International Workshop on Post Moore's Era Supercomputing (in conjunction with Supercomputing '18)*, 12-14, 2018. Preprint [arXiv:1810.07765](https://arxiv.org/abs/1810.07765)

Ruslan Shaydulin and Ilya Safro. Aggregative Coarsening for Multilevel Hypergraph Partitioning. In *Proceedings of 17th International Symposium on Experimental Algorithms (SEA 2018)*, 103:2:1-2:15, 2018. DOI: [10.4230/LIPIcs.SEA.2018.2](https://doi.org/10.4230/LIPIcs.SEA.2018.2)

Ruslan Shaydulin, Jie Chen, and Ilya Safro. Relaxation-Based Coarsening for Multilevel Hypergraph Partitioning. *Multiscale Modeling & Simulation*, 17(1):482-506, 2019. DOI: [10.1137/17M1152735](https://doi.org/10.1137/17M1152735)

Invited Articles and White Papers

Ruslan Shaydulin, Martin Suchara and Jeffrey Larson. Standardized low-level noise characterization to differentiate DOE quantum testbeds. *Quantum Computing Testbeds Stakeholder Workshop White Paper*, 2021

Yuri Alexeev, Jeffrey Larson, Sven Leyffer, and Ruslan Shaydulin. Solving Combinatorial Optimization Problems on Quantum Computers. In *SIAM News Vol. 53 #6 July/August 2020*

Online Preprints and In-Submission Works

Lucas Slattery, Ruslan Shaydulin, Shouvanik Chakrabarti, Marco Pistoia, Sami Khairy, Stefan M. Wild. Numerical evidence against advantage with quantum fidelity kernels on classical data. *In submission*. Preprint: [arXiv:2211.16551](https://arxiv.org/abs/2211.16551)

Dylan Herman*, Ruslan Shaydulin*, Yue Sun*, Shouvanik Chakrabarti, Shaohan Hu, Pierre Minssen, Arthur Rattew, Romina Yalovetzky, Marco Pistoia. Portfolio Optimization via Quantum Zeno Dynamics on a Quantum Processor. *In submission*. Preprint: [arXiv:2209.15024](https://arxiv.org/abs/2209.15024)

Abdulkadir Canatar, Evan Peters, Cengiz Pehlevan, Stefan M. Wild, Ruslan Shaydulin. Bandwidth Enables Generalization in Quantum Kernel Models. *In submission*. Preprint: [arXiv:2206.06686](https://arxiv.org/abs/2206.06686)

Ruslan Shaydulin, Justin Sybrandt. To Agile, or not to Agile: A Comparison of Software Development Methodologies. Preprint: [arXiv:1704.07469](https://arxiv.org/abs/1704.07469)

Patents

Sergey Bravyi, Shaohan Hu, Dmitri Maslov, Ruslan Shaydulin. Partitioned template matching and symbolic peephole optimization. *Pending*. Patent application [US20220129411A1](https://patents.google.com/patent/US20220129411A1)

Contributed Talks and Posters

Quantum Information Processing '23 <i>Ghent, Belgium</i> Presented posters on recent quantum algorithm advances at JPMorgan Chase	Feb 7, 2023
INFORMS Annual Meeting '22 <i>Indianapolis, IN</i> Gave an invited talk "Portfolio Optimization via Quantum Zeno Dynamics on a Quantum Processor".	Oct 17, 2022
Workshop on Quantum Computing and Operations Research <i>Fields Institute</i> Gave an invited talk " Quantum optimization of financial problems ".	Oct 14, 2022
Chicago Quantum Exchange Seminar <i>University of Chicago</i> Gave an invited talk "Solving Constrained Optimization Problems on Quantum Computers".	Sep 29, 2022
Quantum Computing Tutorial <i>Argonne National Laboratory</i> Led a tutorial on Quantum Approximate Optimization Algorithm.	Jun 15, 2022
Southeast Quantum Computing Workshop <i>University of Georgia</i> Gave an invited talk "Importance of Kernel Bandwidth in Quantum Machine Learning."	May 20, 2022
American Physical Society March Meeting '22 <i>Chicago, IL</i> Gave talk "Importance of Kernel Bandwidth in Quantum Machine Learning."	Mar 17, 2022
Quantum Information Processing '22 <i>Pasadena, CA</i> Presented poster "Importance of Kernel Bandwidth in Quantum Machine Learning."	Mar 8, 2022
DOE Quantum Computing Testbeds Stakeholder Workshop Gave talk "Standardized Low-Level Noise Characterization to Differentiate DOE Quantum Testbeds"	Dec 2, 2021
Supercomputing '21 (International Workshop on Quantum Computing Software) Gave talk "QAOAKit: A Toolkit for Reproducible Study, Application, and Verification of the QAOA"	Nov 15, 2021
IEEE Quantum Week 2021 Gave talks "Classical Symmetries and QAOA" and "Error Mitigation for Deep Quantum Optimization Circuits by Leveraging Problem Symmetries"	Oct 17-22, 2021
QIC seminar <i>University of Delaware</i> Gave talk "Towards Practical Advantage in Quantum Optimization"	Sep 29, 2021
SIAM Conference on Optimization (OP21) Gave a talk " Classical Symmetries and QAOA "	Jul 21, 2021
Quantum Computing Tutorial <i>Argonne National Laboratory</i> Led a tutorial on Quantum Approximate Optimization Algorithm.	Jun 16, 2021
HPC-AI colloquium <i>Intel</i> Gave talk "Towards Practical Advantage in Quantum Optimization"	Jun 8, 2021

CM/QIS seminar <i>Virginia Tech</i> Gave talk "Classical Symmetries and QAOA"	Apr 19, 2021
Chicago Quantum Exchange Member and Partner Workshop Gave talk "Quantum Optimization: the Next Five Years"	Apr 19, 2021
Sixth International Conference for Young Quantum Information Scientists (YQIS 2021) Gave talk "Classical Symmetries and QAOA"	Apr 12, 2021
LANS Seminar <i>Argonne National Laboratory</i> Gave talk "Classical Symmetries and QAOA"	Mar 24, 2021
APS March Meeting Gave talk "Classical Symmetries and QAOA"	Mar 17, 2021
INFORMS Annual Meeting '20 Gave talk "Classical Symmetries and the Quantum Approximate Optimization Algorithm"	Nov 13, 2020
Quantum Computing Seminar <i>IBM Research</i> Gave talk "Practical Optimization on Near-term Quantum Computers"	Sep 24, 2020
Quantum Computing Tutorial <i>Argonne National Laboratory</i> Led a tutorial on Quantum Approximate Optimization Algorithm .	Jun 15, 2020
SIAM Conference on Parallel Processing for Scientific Computing (PP20) <i>Seattle, WA</i> Gave talk "Multilevel Hybrid Quantum-Classical Algorithms on Graphs"	Feb 13, 2020
Information Science and Technology Institute Seminar <i>Los Alamos National Laboratory</i> Gave talk "Practical Optimization on Near-term Quantum Computers"	Nov 26, 2019
Supercomputing '19 <i>Denver, CO</i> Gave talk "Hybrid Quantum-Classical Algorithms for Graph Problems: Forging a Path to Near-Term Applications" at the Clemson booth and at the SC Theater	Nov 17-22, 2019
Mathematics and Computer Science Seminar <i>Argonne National Laboratory</i> Gave talk "Practical Optimization on Near-term Quantum Computers"	Nov 15, 2019
Quantum Computing Seminar <i>Oak Ridge National Laboratory</i> Gave talk "Practical Optimization on Near-term Quantum Computers"	Nov 4, 2019
International Green and Sustainable Computing Conference (IGSC 2019) <i>Alexandria, VA</i> Presented poster "Reinforcement Learning for Quantum Approximate Optimization"	Oct 22, 2019
Chicago Quantum Exchange Meeting <i>University of Chicago</i> Presented poster "Practical Quantum Approximate Optimization"	June 12, 2019

SIAM Conference on Computational Science and Engineering (CSE19) <i>Spokane, WA</i> Presented poster " Quantum Local Search for Graph Community Detection "	Feb 25-28, 2019
Quantum Computing Tutorial <i>Argonne National Laboratory</i> Gave talk " QAOA Algorithm Introduction "	Dec 10-11, 2018
Supercomputing '18 <i>Dallas, TX</i> Gave talk "Community Detection Across Emerging Quantum Architectures" at Clemson booth	Nov 11-16, 2018
Quantum Computing Workshop <i>Argonne National Laboratory</i> Presented preliminary results on " Machine Learning on Near-Term Quantum Computers "	Jul 25-27, 2018
32nd Clemson Mini-Conference on Discrete Mathematics and Algorithms <i>Clemson University</i> Presented poster "Relaxation-Based Coarsening for Multilevel Hypergraph Partitioning"	Nov 4, 2017
58th Scientific Conference <i>Moscow Institute of Physics and Technology</i> Gave talk "IPC (Inter-Process Communication) in OS X"	Nov 23-28, 2015

Leadership and Service

Requested Reviewer (peer review)

- IOP Quantum Science and Technology (2022)
- Springer Quantum Information Processing (2022)
- [Quantum](#) journal (2020, 2021, 2022, 2023)
- npj Quantum Information (2020)
- IEEE Transactions on Computers (2020)
- IEEE Transactions on Quantum Engineering (2020, 2021, 2022)
- IOP New Journal of Physics (2021)
- ACM Journal of Experimental Algorithmics (2021)

Program Committee Member

- IEEE International Conference on Quantum Computing and Engineering ([QCE21](#), QCE22)
- The Third International Workshop on Quantum Resource Estimation ([QRE 2021](#))

IEEE Quantum Week 2022 Co-organized a workshop on Quantum Algorithms for Financial Applications	Sep 23, 2022
INFORMS Annual Meeting Led and co-organized a tutorial "Combinatorial Optimization on Quantum Computers" and a workshop "The Future of Quantum Optimization"	Oct 25, 2021
IEEE Quantum Week 2021 Session chair	Oct 19, 2021
Afro-Academic, Cultural, Technological and Scientific Olympics (ACT-SO) Mentored a high-school student	2021-22

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SIAM Conference on Optimization (OP21) Co-organized a minisymposium " Quantum Discrete Optimization "	Jul 20-23, 2021
Chicago Quantum Exchange Co-organized a workshop " Quantum Feature Maps for the NISQ Era "	Apr 16, 2021
IEEE Quantum Week Led and co-organized a minitutorial " Combinatorial Optimization on Quantum Computers "	Oct 15, 2020
SIAM Conference on Parallel Processing for Scientific Computing (PP20) <i>Seattle, WA</i> Led and co-organized a minitutorial " Combinatorial Optimization on Quantum Computers "	Feb 12-15, 2020
SIAM Conference on Parallel Processing for Scientific Computing (PP20) <i>Seattle, WA</i> Co-organized a minisymposium "Recent Advances and Trends in Hybrid Quantum-Classical Algorithms"	Feb 12-15, 2020
Supercomputing '19 <i>Denver, CO</i> Student volunteer, run tutorials, technical program session and Birds-of-Feather	Nov 17-22, 2019
Quantum Computing Tutorial <i>Argonne National Laboratory</i> Led and co-organized a hands-on tutorial for Qiskit, a framework for quantum computing	May 14, 2019
Mathematics Teacher, Summer School <i>Kostroma, Russia</i> School administrator, organized extracurricular activities.	Summer 2014

Teaching

Network Science CPSC 8480 <i>Clemson University</i> Teaching Assistant responsible for grading and answering students' questions during office hours	Fall 2018, 2019
Design and Analysis of Algorithms CPSC 8400 <i>Clemson University</i> Teaching Assistant responsible for grading and answering students' questions during office hours	Spring 2019
Algorithms and Data Structures CPSC 2120 <i>Clemson University</i> Teaching Assistant responsible for running the lab section, grading and answering students' questions during office hours	Spring 2019
Mathematics Teacher, Summer School <i>Kostroma, Russia</i> Created and taught a course on basics of graph theory, combinatorics and number theory to middle and high school students.	Summer 2014

Languages and Technologies

Python, C

Prior experience: C++, MATLAB, Objective-C, Swift, Bash, Qiskit

Limited prior experience: R, SQL, yacc, bison, AWS, Google Cloud Engine

Technologies and tools: UNIX/Linux, MPI, OpenMP

Honors and Awards

- Outstanding Young Engineer Award for the year 2021, awarded by IEEE Chicago Section
- Best Student Paper at IEEE HPEC 2019 (of ~50 student papers), *recipient*
- IBM Teach-the-Qiskit-Teacher training program, *selected to represent Argonne National Laboratory*
- Moscow Institute of Physics and Technology Abramov scholarship – Top 300 students in the university, based on high academic achievement, *recipients*