# Arnab K. Paul

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## Research Interest

My interests lie in various domains of computer systems including **distributed systems**, **parallel file systems**, and **high performance computing**. Recently, my interest has also piqued in the direction of **big data analysis** to optimize system performance. I am also trying to optimize **systems for ML** as well as use **ML models to optimize systems**. I have also taken an active interest in data optimization for **resource-constrained devices**, such as IoTs and edge/fog computing.

#### Education

2015–2020 **Ph.D., Computer Science and Applications**, Virginia Polytechnic Institute and State University (Virginia Tech).

**Dissertation:** An application-attuned framework for optimizing HPC storage systems.

Advisor: Ali R. Butt. GPA: 4.0/4.0

2015–2018 M.S., Computer Science and Applications, Virginia Tech.

**GPA:** 3.85/4.0

2013–2015 M.Tech., Computer Science and Engineering, National Institute of Technology, Rourkela.

Thesis: Dynamic virtual machine placement in cloud computing.

Advisor: Bibhudatta Sahoo. GPA: 9.56/10.0 (Gold Medalist - First position in the department)

2009–2013 **B.Tech., Computer Science and Engineering**, West Bengal University of Technology. *GPA:* 9.02/10.0 (First position in the department)

2009 Class XII - I.S.C. Examination, Council for The Indian School Certificate Examination.

Hill Top School, Jamshedpur

Marks: 96.25%

2007 Class X - I.C.S.E, Council for The Indian School Certificate Examination.

Hill Top School, Jamshedpur

Marks: 95.8%

# **Work Experience**

- 12/21-present BITS Pilani, K K Birla Goa Campus Department of Computer Science & Information Systems, Assistant Professor.
- 09/20–10/21 Oak Ridge National Laboratory Analytics & Al Methods at Scale Group, Postdoctoral Research Associate.
  - $\circ$  Analyze the I/O patterns of emerging data science applications, and identify performance bottlenecks.
  - ML techniques to predict I/O patterns to help job scheduling in large-scale supercomputers, like Summit.
- 08/15-08/20 Virginia Tech Distributed Systems and Storage Laboratory, Ph.D. Student in Dept. of CS.
  - Conducted an empirical study on the use of containers in HPC platforms.
    - Developed an approach for estimating the performance of edge-based clustering applications.
    - Built an I/O framework for load balancing storage servers in HPC parallel file systems, like Lustre.
    - o Developed a model to optimize data partitioning for in-memory data analytics platforms, like Spark.
- 06/19–08/19 **Cray Inc.**, *Graduate Research Intern*.

Mentors: Cory Spitz, Nathan Rutman (Cray Inc.), and Scott White (Los Alamos National Laboratory)

- Built a scalable re-indexer for BRINDEXER a metadata indexing tool used in Cray.
- 05/18–08/18 Lawrence Livermore National Laboratory, Graduate Student Summer Intern (Computation Scholar). Mentor: Kathryn Mohror
  - Analyzed the characteristics of metadata and I/O for jobs running on two supercomputers at LLNL.
- 05/17–08/17 **Argonne National Laboratory**, *Graduate Student Summer Intern (Research Aide)*. **Mentor:** Ian Foster
  - Created FSMonitor a tool for scalable file system event monitoring for arbitrary file systems.

- 01/14-05/15 NIT Rourkela Information Security and Data Communication Laboratory, M. Tech. Student.
  - Proposed an approach for dynamic virtual machine placement in the cloud using game theory.
  - o Applied and analyzed greedy algorithms on virtual machine distribution across data centers.

# **Teaching Experience**

Fall 2022 Instructor-In-Charge, BITS Pilani.

CS F446: Data Storage Technologies and Networks: Prepared and gave lectures to (~40 students), prepared assignments and examinations, awarded final grades, mentored teaching assistants.

Instructor, BITS Pilani.

CS F372: Operating Systems: Assisted in tutorials, assignments, evaluative labs and evaluation of mid sem and comprehensive examinations.

Spring 2022 Instructor, BITS Pilani.

CS F111: Computer Programming: Prepared and gave lectures to ( $\sim$ 250 students), prepared assignments and examinations, awarded final grades, mentored teaching assistants.

Fall 2019 Instructor, Virginia Tech & courses.cs.vt.edu/cs2505/fall2019/.

CS2505: Introduction to Computer Organization - I: Prepared and gave lectures to two sections ( $\sim$ 150 students), prepared assignments and examinations, awarded final grades, mentored graduate teaching assistants.

2015–2019 Graduate Teaching Assistant, Department of Computer Science, Virginia Tech.

Spring 2019	CS 3214: Operating Systems	Recitation sessions, grading, guest lectures, office hours
Fall 2018	CS 5584: Network Security	Project ideas with 15 groups, grading, office hours
Spring 2018	CS 3114: Data Structures and Algorithms	Grading, office hours
Fall 2017	CS 2506: Introduction to Computer Organization - II	Grading, office hours
Spring 2017, Fall 2016	CS 2114: Software Design and Data Structures	Lab sessions for 60 students, practice sessions, designing and grading assignments, office hours
Spring 2016, Fall 2015	CS 1054: Introduction to Programming in Java	Lab sessions for 60 students, grading, office hours

2014–2015 Graduate Teaching Assistant, Department of Computer Science, NIT Rourkela.

Autumn 2014, CS 171: Computing Lab

Spring 2015

Prepared and gave lectures, held lab sessions for 220 students, preparing and grading assignments

Spring 2015 CS 670: Data Mining Lab

Lab sessions for 30 students, grading

# Publications (Google Scholar & scholar.google.co.in/citations?user=az8MAG0AAAAJ&hl=en)

#### **Book Chapters**

- CRC Press '20 Arnab K. Paul. Edge or Cloud: What to Choose?. In Cloud Network Management: An IoT based Framework, CRC Press, Taylor & Francis Group, pages 14, 2020. © doi.org/10.1201/9780429288630
- IGI Global '17 Arnab Kumar Paul, and Bibhudatta Sahoo. Dynamic virtual machine placement in cloud computing. In Resource Management and Efficiency in Cloud Computing Environments, pp. 136-167, IGI Global, 2017. & doi.org/10.4018/978-1-5225-1721-4.ch006

#### **Journal Publications**

- PEVA '22 [IF: Ahmad Maroof Karimi<sup>1</sup>, Arnab K. Paul<sup>1</sup>, and Feiyi Wang. I/O Performance Analysis of Ma-2.205] chine Learning Workloads on Leadership Scale Supercomputer. Performance Evaluation Journal. C doi.org/10.1016/j.peva.2022.102318 <sup>1</sup> Both authors contributed equally.
- TPDS '21 [IF: Nannan Zhao, Vasily Tarasov, Hadeel Albahar, Ali Anwar, Lukas Rupprecht, Dimitrios Skourtis, Arnab K. 3.757]

  Paul, Keren Chen, and Ali R. Butt. Large-Scale Analysis of Docker Images and Performance Implications for Container Storage Systems. IEEE Transactions on Parallel and Distributed Systems (TPDS), pages 13, April 2021. Addi.org/10.1109/TPDS.2020.3034517

#### **Conference and Workshop Publications**

Cluster '22 Awais Khan, Arnab K. Paul, Christopher Zimmer, Sarp Oral, Sajal Dash, Scott Atchley, and Feiyi Wang. [Core Rank: A] HVAC: Removing I/O Bottleneck for Large-Scale Deep Learning Applications. In Proceedings of the 24th IEEE International Conference on Cluster Computing, Heidelberg, Germany, pages 12, September 2022.

- HPDC '22 Arnab K. Paul<sup>1</sup>, Jong Youl Choi<sup>1</sup>, Ahmad Maroof Karimi, and Feiyi Wang. Machine Learning Assisted [Core Rank: A] HPC Workload Trace Generation for Leadership Scale Storage Systems. In Proceedings of the 31st International ACM Symposium on High-Performance Parallel and Distributed Computing, Minnesota, USA, pages 13, June 2022. doi.org/10.1145/3502181.3531457
- HPDC '22 Jean Luca Bez<sup>1</sup>, Ahmad Maroof Karimi<sup>1</sup>, **Arnab K. Paul**<sup>1</sup>, Bing Xie<sup>1</sup>, Suren Byna, Philip Carns, [Core Rank: A] Sarp Oral, Feiyi Wang, and Jesse Hanley. Access Patterns and Performance Behaviors of Multilayer Supercomputer I/O Subsystems under Production Load. In Proceedings of the 31st International ACM Symposium on High-Performance Parallel and Distributed Computing, Minnesota, USA, pages 13, June 2022. Pdoi.org/10.1145/3502181.3531461

  <sup>1</sup> All four authors contributed equally.
- CCGrid '22 Hadeel Albahar, Shruti Dongari, Yanlin Du, Nannan Zhao, Arnab K. Paul, and Ali R. Butt. Schedtune: [Core Rank: A] A Heterogeneity-aware GPU Scheduler for Deep Learning. In Proceedings of the 22nd IEEE/ACM International Symposium on Cluster, Cloud and Internet Computing, Italy, pages 10, May 2022. Accepted
- MASCOTS Arnab K. Paul<sup>1</sup>, Ahmad Maroof Karimi<sup>1</sup>, and Feiyi Wang. Characterizing Machine Learning I/O '21 [Core Rank: Workloads on Leadership Scale HPC Systems. In Proceedings of the 29th IEEE International Symposium on the Modeling, Analysis, and Simulation of Computer and Telecommunication Systems, pages 8, November 2021. Action of the doi.org/10.1109/MASCOTS53633.2021.9614303 Both authors contributed equally.
- REX-IO '21 @ Sarah Neuwirth and **Arnab K. Paul**. Parallel I/O Evaluation Techniques and Emerging HPC Workloads: Cluster '21 A Perspective. In Proceedings of the 1st Workshop on Re-envisioning Extreme-Scale I/O for Emerging [Core Rank: A] Hybrid HPC Workloads (REX-IO) in conjunction with IEEE Cluster'21, pages 8, September 2021. Cdoi.org/10.1109/Cluster48925.2021.00100
- HiPC '20 [Core Arnab K. Paul, Olaf Faaland, Adam Moody, Elsa Gonsiorowski, Kathryn Mohror, and Ali R. Butt.

  Rank: National Understanding HPC Application I/O Behavior Using System Level Statistics. In Proceedings of the 27th IEEE International Conference on High Performance Computing, Data, and Analytics, pages 10, December 2020. (AR: 23%). & doi.org/10.1109/HiPC50609.2020.00034
  - SMDS '20 Breno Dantas Cruz, Arnab K. Paul, Zheng Song, and Eli Tilevich. STARGAZER: A Deep Learn[Core Rank: B] ing Approach for Estimating the Performance of Edge-Based Clustering Applications. In Proceedings of the IEEE International Conference on Smart Data Services, pages 9, October 2020. (AR: 17%).

    Complete doi.org/10.1109/SMDS49396.2020.00009 (Awarded the YESC award for the most innovative student paper at IEEE Services 2020!)
- Cloud '20 [Core Subil Abraham<sup>1</sup>, Arnab K. Paul<sup>1</sup>, Redwan Ibne Seraj Khan, and Ali R. Butt. On the Use of Containers in High Performance Computing Environments. In Proceedings of the IEEE International Conference on Cloud Computing, pages 9, October 2020. (AR: 17%). Codoi.org/10.1109/CLOUD49709.2020.00048

  1 Both authors contributed equally.
  - CCGrid '20 Arnab K. Paul, Brian Wang, Nathan Rutman, Cory Spitz, and Ali R. Butt. Efficient Metadata Indexing for HPC Storage Systems. In Proceedings of the 20th IEEE/ACM International Symposium on Cluster, Cloud and Internet Computing, Australia, pages 10, May 2020. (AR: 23%).
  - PDSW '19 @ Arnab K. Paul, Olaf Faaland, Adam Moody, Elsa Gonsiorowski, Kathryn Mohror, and Ali R. Butt. SC '19 [Core | Improving I/O Performance of HPC Application Using Intra-Job Scheduling. Work-In-Progress in Proceedings of the 4th Joint International Workshop on Parallel Data Storage & Data Intensive Scalable Computing Systems (PDSW-DISC'19) in conjunction with SC'19, Denver, CO, pages 1, November 2019.
  - Cluster '19 Arnab K. Paul, Ryan Chard, Kyle Chard, Steven Tuecke, Ali R. Butt, and Ian Foster. FSMonitor: Scalable File System Monitoring for Arbitrary Storage Systems. In Proceedings of the IEEE International Conference on Cluster Computing, Albuquerque, NM, pages 11, September 2019. (AR: 22%). Colorg/10.1109/CLUSTER.2019.8891045
  - IPDPS '19 Bharti Wadhwa, Arnab K. Paul, Sarah Neuwirth, Feiyi Wang, Sarp Oral, Ali R. Butt, Jon Bernard, and [Core Rank: A] Kirk W. Cameron. iez: Resource Contention Aware Load Balancing for Large-Scale Parallel File Systems. In Proceedings of the IEEE International Parallel and Distributed Processing Symposium, Rio de Janeiro, Brazil, pages 11, May 2019. (AR: 25%). & doi.org/10.1109/IPDPS.2019.00070

- ComNet-IoT Hyogi Sim, Arnab K. Paul, Eli Tilevich, Ali R. Butt, and Muhammad Shahzad. CSLIM: Automated © ICDCN '19 Extraction of IoT Functionalities from Legacy C Codebases. In Proceedings of the 8th International Workshop on Computing and Networking for IoT and Beyond in conjunction with ICDCN '19, Bangalore, India, pages 6, January 2019. © doi.org/10.1145/3288599.3296013
- PDSW '17 @ Arnab K. Paul, Ryan Chard, Kyle Chard, Steven Tuecke, Ali R. Butt, and Ian Foster. Toward Scalable SC '17 [Core Monitoring on Large-Scale Storage for Software Defined Cyberinfrastructure. In Proceedings of the 2nd Joint International Workshop on Parallel Data Storage & Data Intensive Scalable Computing Systems (PDSW-DISC'17) in conjunction with SC'17, Denver, Colorado, pages 6, November 2017.
- WHPC '16 @ Sangeetha B. Srinivasa, **Arnab K. Paul**, Arpit Goyal, Feiyi Wang, Sarp Oral, and Ali R. Butt. I/O Load SC '16 [Core Rank: A] Scriptor Sc
  - Cluster '16 Arnab Kumar Paul, Wenjie Zhuang, Luna Xu, Min Li, Mustafa Rafique, and Ali R. Butt. CHOPPER: Optimizing Data Partitioning for In-Memory Data Analytics Frameworks. In Proceedings of the IEEE International Conference on Cluster Computing, Taiwan, pages 10, September 2016. (AR: 24%).
- ICACCCT '14 Arjun Datta, and Arnab Kumar Paul. Online compiler as a cloud service. In Proceedings of 2014 IEEE International Conference on Advanced Communications, Control and Computing Technologies, pp. 1783-1786. IEEE, 2014. & doi.org/10.1109/ICACCCT.2014.7019416

#### **Posters**

- SC '19 [Core Rank: A] Arnab K. Paul, Olaf Faaland, Adam Moody, Elsa Gonsiorowski, Kathryn Mohror, and Ali R. Butt. Understanding HPC Application I/O Behavior Using System Level Statistics. In Proceedings of The International Conference for High Performance Computing, Networking, Storage, and Analysis (SC) 2019, Denver, CO, pages 3, November 2019. Sc19.supercomputing.org/proceedings/tech\_poster/tech\_poster\_pages/rpost157.html
  - Cray '19 Arnab K. Paul, Nathan Rutman, Cory Spitz, Brian Wang, Peter Bojanic, and Ali R. Butt. Analyzing the performance of file system indexing tools. In Cray Inc. Summer Student Poster Session, Minneapolis, MN, August 2019.
  - LLNL '18 Arnab K. Paul, Olaf Faaland, Adam Moody, Elsa Gonsiorowski, Kathryn Mohror, and Ali R. Butt. Analysis and predictive modeling of HPC I/O workloads. In LLNL Computation Summer Student Poster Session, Livermore, CA, August 2018.

#### **Theses**

#### **Others**

SMC '21 Sajal Dash, **Arnab Kumar Paul**, Sarp Oral, Feiyi Wang. SMC Data Challenge 2021: Analyzing Resource Utilization and User Behavior on Titan Supercomputer. In Smoky Mountains Computational Sciences & Engineering Conference.

# **Proposal Grants**

- 2022 **BioCyTiH Foundation of Department of Science and Technology, Government of India**, Co-PI of A Scalable Cloud and Edge-based Framework to Ease The Deployment of IoT-based Applications, **Rs. 41.16 Lakhs**.
- 2022 **BITS Pilani Research Initiation Grant**, PI of *Optimization of Federated Learning Models on Hetero- geneous IoT Devices*, **Rs. 2 Lakhs**.

## **Talks and Presentations**

- 2021 **Oak Ridge National Laboratory**, Analyzing Machine Learning Workloads on Leadership Scale HPC Storage Systems, Oak Ridge Postdoctoral Association Research Symposium.
- 2021 **Netaji Subhash Engineering College**, *Decoding Process Management in Operating Systems*, Special Lecture.
- 2020 HiPC, Understanding HPC Application I/O Behavior Using System Level Statistics, Paper Presentation.
- 2020 **Oak Ridge National Laboratory**, A Framework for Whole Stack Optimization of Distributed Storage Systems, Job talk.
- 2020 **Lawrence Berkeley National Laboratory**, A Framework for Whole Stack Optimization of Distributed Storage Systems, Job talk.
- 2019 SC, Understanding HPC Application I/O Behavior Using System Level Statistics, Poster presentation.
- 2019 SC, Improving I/O Performance of HPC Application Using Intra-Job Scheduling, WIP presentation.
- 2019 Cluster, Scalable File System Monitoring for Arbitrary Storage Systems, Paper presentation.
- 2019 **ICDCN**, Automated extraction of IoT functionalities from legacy C codebases, Paper presentation.
- 2017 BigData, I/O Load Balancing for Big Data HPC Applications, Paper presentation.
- 2017 **PDSW @ SC**, Toward Scalable Monitoring on Large-Scale Storage for Software Defined Cyberinfrastructure, Paper presentation.
- 2016 Cluster, Optimizing Data Partitioning for In-Memory Data Analytics Frameworks, Paper presentation.

#### **Awards and Honors**

- 2020 Awarded the YESC award for most innovative student paper at IEEE Services 2020, Beijing, China
- 2019-2020 BitShares Fellowship, Department of Computer Science, Virginia Tech
  - 2019 Travel Grant Recipient, IEEE Cluster, Albuquerque, NM, USA
  - 2019 Student Volunteer, SC, Denver, CO, USA
- 2018, '19, '20 Member of the Dean's Graduate Team & Ambassador to the College of Engineering, Virginia Tech
  - 2018 Student Volunteer, SCiNet @ SC, Dallas, TX, USA
  - 2017-2018 President, Bengali Students' Association, Virginia Tech
  - 2017-2018 BitShares Fellowship, Department of Computer Science, Virginia Tech
    - 2017 Travel Grant Recipient, IEEE BigData, Boston, MA, USA
    - 2016 Travel Grant Recipient, IEEE Cluster, Taipei, Taiwan
    - 2016 Student Volunteer, SC, Salt Lake City, Utah, USA
    - 2015 Gold Medalist, Department of Computer Science, National Institute of Technology Rourkela
    - 2015 Recognition for building a university website for project and advisor allocation at NIT Rourkela
    - 2015 Recognition for building a website for CWS hospital in Rourkela & www.cwshospital.org
    - 2013 Recognition for Rank 1, Department of Computer Science, West Bengal University of Technology
    - 2010 Golden Jubilee Scholarship, Highest Marks in Class XII, Tata Motors Limited, Jamshedpur
    - 2009 Recognition for holding  $1^{st}$  rank from Kindergarten to Std. XII (all 15 years), Hill Top School
    - 2009 Tata Hitachi Award, Tata Motors Limited, Jamshedpur
    - 2008 Golden Jubilee Scholarship, Highest Marks in Class X, Tata Motors Limited, Jamshedpur
    - 2007 Young Achiever Award, Highest Marks, Tata Cummins, Jamshedpur

## **Professional Service**

Workshop REX-IO '22, '21 (Workshop on Re-envisioning Extreme-Scale I/O for Emerging Hybrid HPC Workloads)

Co-Chair in conjunction with IEEE Cluster 2022, 2021

TPC Member ICDCN '23, AHPC '22 (Advances in High-Performance Computing), ADCIS '22, SC '21, AHPC '21,

Cloud Computing '21, Book on Convergence of Deep Learning in Cyber-IoT Systems and Security '21,

ICDCS '20

Reviewer BITS EEE CON '22, ADCIS '22, IPDPS '22, IEEE Transactions on Parallel and Distributed Systems

(TPDS) '19 '20, Neural Processing Letters (NEPL) '20 '21, Cluster Computing Journal '19 '20 '21,

IJGHPC '18 '19 '20, ASTESJ '18, AUTOSOFT Journal '18, MGS Journal '17

External IEEE TSC Journal '18, BigData '17 '18, Cluster '17 '18 '20, ECOOP '20, HPDC '17 '18 '20, IC2E '17,

Reviewer ICCD '19, ICDCS '17 '18 '19, ICS '17 '18, IPDPS '18 '19 '20

Facilitator SC '20, HPDC '19

Mentor SC '20

# **Mentoring Experience**

Graduate Debasmita Biswas (Ph.D., Virginia Tech, 2020 - )

Students Ahmad Yazdani (Ph.D., Virginia Tech, 2020 - )

Redwan Ibne Seraj Khan (Ph.D., Viriginia Tech, 2019 - )

Subil Abraham (MS, Virginia Tech, 2019 - 2020) (Thesis: On the Use of Containers in High Performance Computing

Arpit Goyal (MS, Virginia Tech, 2016 - 2017) (Thesis: I/O Load Balancing for Lustre Distributed File System)

Undergraduate Students

S Sai Vineet (B.E., BITS Pilani, Goa, 2021 - 2022) (Thesis: A Data-Centric Approach for Analyzing Large-Scale Deep Learning Applications)

Amit Chauhan (B.E., BITS Pilani, Goa, 2021 - 2022) (Project: Enabling I/O Functionality in Fog Simulators)

Subrat Dhal (B.Tech., NIT Rourkela, 2014 - 2015) (Project: Performance of bin-packing algorithms for virtual machine placement in the cloud)

Harshit Verma (B.Tech., NIT Rourkela, 2014 - 2015) (Project: Performance of bin-packing algorithms for virtual machine placement in the cloud)

#### Skills

General C, C++, Python, Java, UNIX, git, svn, latex, gnuplot.

Analytics Apache Spark, pandas, matplotlib, bigdata analysis, applied machine learning, federated learning.

File Systems Lustre file system, Ceph object store, HDFS, IBM Spectrum Scale (GPFS).

Distributed Containers, cloud computing, key-value stores, edge computing, IoT, map-reduce.

Computing

# Memberships

2016 – present Institute of Electrical and Electronics Engineers (IEEE), Member.

2021 - present Association for Computing Machinery (ACM), Member.

2019 – 2021 Association for India's Development, Blacksburg Chapter.

2018 – 2020 Graduate Students' Council, Department of Computer Science, Virginia Tech.

#### References

- 1. Dr. Ali R. Butt <butta@cs.vt.edu>, Professor, Virginia Tech.
- 2. Dr. lan Foster <foster@anl.gov>, Senior Scientist Argonne National Laboratory, Professor University of Chicago.
- 3. Dr. Eli Tilevich <tilevich@cs.vt.edu>, Professor, Virginia Tech.
- 4. Dr. Feiyi Wang <fwang2@ornl.gov>, Group Leader, Analytics & Al Methods at Scale Group, Oak Ridge National Laboratory.