# Sanjar Hudaiberdiev, PhD

## Staff Scientist, NCBI/NIH

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## Scientific research areas

#### Genomics, Gene Regulation, Disease Genetics (Type 2 Diabetes) Evolution, Origin of Life Machine/Deep Learning, Statistics

## Technical Skills & Domain Knowledges

Biology	Gene regulation (enhancers, silencers), 3D chromatin organization, condensates Type 2 Diabetes: pancreatic islet ( $\beta$ ) cells, islet-specific TFs, risk loci (GWAS) PopGen: common/rare variant analysis, LD blocks, GWAS, PRS Evolution: non-coding regions, ultra-conserved regions, human-specific evolution (HARs, hCONDELs), protein(domain) evolution, phylogenetics/phylogenomics genomic synteny, host-parasite arms race
ML/stats	Statistical Inference, Biostatistics Bayesian modeling, Probabilistic Reasoning, Causality ConvNets, LSTMs, Transformers
ML tools	Tensorflow, PyTorch, Keras Scikit-learn, NumPy/SciPy, R, MATLAB/Octave
Bioinformatics	GWAS, fine-mapping, e/s/raQTLs, MPRA ChIP-seq, RNA-seq, ATAC-seq, Hi-C ENCODE, Roadmap, HCA, 4D Nucleome, UK Biobank Containers (Docker, Singularity), Workflows (Nextflow, Snakemake) Massive data processing, parallel computing, HPC (SLURM, SGE)
Soft. Dev.	OOP, functional programming, Unit tests, Git, CI/CD
Languages	<b>Actively using</b> : Python, R, Rust (learning), Bash <b>Have used</b> : MATLAB, C#, C/C++, Perl
Databases	MySQL, PostgreSQL, SQLite, SQL Server 2008/2010, Oracle 10g.
OS	Linux, MacOS

## Work Experience

2023 – 🛛	Staff Scientist. NCBI, NIH, Bethesda, MD
	- Integrating multi-omics (TF/Histone ChIP-seq, DHS, ATAC-seq, HiC, RNA-binding proteins' binding sites, methylome) data to model disease transcriptional codes using multi-modal fusion deep neural networks to detect disease-causal genetic variation.
	- Using Deep Learning to assess the phenotypic impacts of human-specific (vs. Macaques and Chimpanzees) INDELs in enhancers.

2020 – 2023	Research Fellow. NCBI, NIH, Bethesda, MD
	- Developed TREDNet: A novel Deep Learning method for enhancer detection.
	<ul> <li>Lead a large multidisciplinary collaboration project to apply TREDNet to detect GWAS candidate causal muta- tions linked to Type 2 Diabetes and experimentally verified.</li> </ul>
	- Developed a model for explaining the high-occupancy target (HOT) regions in humans using transcriptional condensates.
2018 – 2020	Postdoctoral Fellow. NCBI, NIH, Bethesda, MD
	Mentor: Ivan Ovcharenko, PhD
	- Spearheaded the transition to Deep Learning methods to study the enhancers.
	- Automated the distributed training of large models (Keras+Tensorflow) on Google Cloud and Biowulf (NIH's HPC cluster).
	- Applied ConvNets and LSTMs to model gene regulation and decompose LD blocks.
	- Managed and implemented the deployment of decades-worth codebase developed in-house to containers (Docker, singularity) and workflows management systems (Nextflow, Snakemake).
2015 – 2018	Postdoctoral Fellow. NCBI, NIH, Bethesda, MD
	Mentor: Eugene Koonin, PhD
	- Studied the general evolution of CRISPR/Cas systems, as well as deep focus on protein CRISPR-associated 4 (Cas4). Paper is cited >55 times, including by Prof. Jennifer Doudna, and has given me an Erdös number of 3.
	- Analyzed evolutionary links between microbial adaptive immune systems and other selfish elements.
	- Gained an expert understanding of microbial genetics, comparative genomics, molecular evolutionary analysis.
2011 – 2014	Graduate research program ICGEB, Trieste, Italy
	<ul> <li>Thesis project: Functional annotation of <i>Quorum Sensing</i> systems in bacteria using subsystem based approach.</li> <li>Implemented a wide range of algorithms and tools of computational genomics and sequence analysis.</li> </ul>
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### Education

09/2011 - 09/2014	PhD in Bioinformatics, <b>ICGEB</b> , Trieste, Italy Thesis: "Computational analysis of quorum sensing systems in bacterial genomes: Developing automated annotation tools." Supervisor: Prof. Sándor PONGOR
09/2006 - 09/2008	MSc in Machine Learning, Istanbul Technical University, Istanbul, Turkey
09/2002 - 09/2006	BSc in Computer Engineering, Erciyes University, Kayseri, Turkey

#### **Publications**

C. Hill, **S. Hudaiberdiev**, I. Ovcharenko **ChromDL: A Next-Generation Regulatory DNA Classifier** ISMB/ECCB 2023 (in submission) bioRxiv ( https://doi.org/10.1101/2023.01.27.525971)

**S. Hudaiberdiev**, I Ovcharenko **Sequence characteristics and an accurate model of abundant hyperactive loci in the human genome** eLife 2023 (in submission) bioRxiv (https://doi.org/10.1101/2023.02.05.527203)

**S. Hudaiberdiev**, D. Taylor, W Song, N Narisu, RM. Bhuiyan, H. Taylor, T Yan, A Swift, L Bonnycastle, DIAMANTE Consortium, M Stitzel, M Erdos, I Ovcharenko, F. S. Collins **Modeling islet enhancers using deep learning identifies candidate causal variants at loci associated with T2D and glycemic traits** *PNAS*. 2023 (being reviewed) medRxiv (https://doi.org/10.1101/2022.05.13.22275035)

EZ Kvon, Y Zhu, G Kelman, CS Novak, I Plajzer-Frick, M Kato, T H Garvin, Q Pham, AN Harrington, R Hunter, J Godoy, E Meky, J Akiyama, V Afzal, S Tran, F Escande, B Gilbert-Dussardier, N Jean-Marçais, **S Hudaiberdiev**, I Ovcharenko, MB Dobbs, CA Gurnett, S Manouvrier-Hanu, F Petit, A Visel, DE Dickel, LA Pennacchio

**Comprehensive in vivo interrogation reveals phenotypic impact of human enhancer variants.** *Cell.* 2020

**Hudaiberdiev S.**, Shmakov S, Wolf YI, Terns M, Makarova KS and Koonin EV **2017**. *Phylogenomics of Cas4 family nucleases*. BMC Evol. Biol. 2017 PMID: 29179671

**Hudaiberdiev, S.**, Choudhary, K.S., Vera, R., Gelencser, Z., Lamba, D. and Pongor, S. **2015**. *Census of solo luxR genes in bacteria*. Frontiers in Cell. Infect. Micriobiol. 2015. doi:10.3389

Dogsa, I; Choudhary K.S; Marsetic, Z; **Hudaiberdiev, S**; Vera, R; Pongor, S, Mandic-Mule, I **2014**. *ComQXPA quorum sensing systems may not be unique to Bacillus subtilis: a census in prokaryotic genomes.* PLoS One. 9(5):e96122. doi: 10.1371

Choudhary, K.S.; **Hudaiberdiev, S.**; Gelencsér, Z.; Coutinho, B.G.; Venturi, V.; Pongor., S. **2013**. *The organization of the Quorum Sensing luxI/R Family Genes in Burkholderia*. Int J Mol Sci. 13727

Gelencsér, Z.; Choudhary, K.S.; Coutinho, B.G.; **Hudaiberdiev, S.**; Galbáts, B.; Venturi, V.; Pongor., S. **2012** *Classifying the topology of AHL-driven quorum sensing circuits in proteobacterial genomes.* Sensors. 12(5), 5432-5444.

Gelencsér, Z.; Galbáts, B.; Gonzalez, J.F.; Choudhary, K.S.; **Hudaiberdiev, S.**; Venturi, V.; Pongor, S. **2012**. Chromosomal arrangement of AHL.driven quorum sensing circuits in Pseudomonas. ISRN Microbiology. 2012, 6.

## Oral presentations

- 2023 Sequence characteristics and an accurate model of abundant hyperactive loci in the human genome NLM IRP Seminar
- 2022 Transcriptional regulation and disease genetics using Deep Learning NLM IRP Seminar
- 2021 Deep causality in non-coding GWAS SNPs. NLM Summer Lectures Series. NLM
- 2020 Using Deep Learning to to infer causality of GWAS SNPs. METU, Ankara, Turkey
- 2019 Recurrent Language model for enhancers. NLM Summer Lectures Series. NLM
- 2019 Understanding the grammar of enhancers using Deep Learning. NHGRI
- 2019 Causal mutations in ZRS enhancer region using Deep Learning. LBNL, Berkeley
- 2017 Phylogenomics of Cas4 family nucleases. AiChE. Raleigh, NC
- 2016 Current topics in biological sequence analysis. ICGEB. Trieste, Italy

## Posters

- 2021 Hyperactive loci within non-coding regulatory regions of human genome *Mechanisms of Eukaryotic Transcription*, CSHL, NY.
- 2019 Two-stage Deep Learning cross-tissue predictor of enhancers shows unprecedented accuracy in detection of causal regulatory variants. *Mechanisms of Eukaryotic Transcription*, CSHL, NY.
- 2019 Using Deep Learning to understand the grammar of enhancers. *RECOMB*, Washington DC
- 2017 Phylogenomics of Cas4 family nucleases. International conference on CRISPR Technologies, Raleigh, NC
- 2013 Computational approaches to microbial communication/quorum sensing signaling. BAGECO, Ljubljana, Slovenia

#### Awards

- Fellows Award for Research Excellence 2019, NIH, Bethesda, MD
- ICGEB PhD fellowship 2011, ICGEB, Trieste, Italy
- Scholarship for research in Machine Learning/Bioinformatics. 2008, TUBITAK, Istanbul, Turkey
- Scholarship for BS final year project. 2007, TUBITAK, Kayseri, Turkey
- Scholarship of Turkish ministry of education for undergraduate studies. 2002/2007, Turkey
- Bronze medals in national physics olympiads for highschool students. 2001/2002, Kyrgyzstan

## Teaching & Mentorship

- Co-mentor, Post-bac student, 2020 NIH
- Co-mentor, Summer research student, 2019 NIH
- Lead instructor, Summer intern journal club, 2018 NIH
- Co-mentor, Summer research student, 2018 NIH

BMC Bioinformatics, NAR Database, Frontiers in Microbiology

## Organization & Leadership

Commitee

- 2023 Fellow Award for Research Excellence. Committee member
- 2022 Fellow Award for Research Excellence. Committee member

Organised

- 2013 Bioinformatics: Computer Methods in Molecular Biology –ICGEB, Trieste, Italy
- 2014 Bioinformatics: Computer Methods in Molecular Biology –ICGEB, Trieste, Italy

#### Languages

Kyrgyz Native English, Turkish Fluent Italian, Russian Advanced