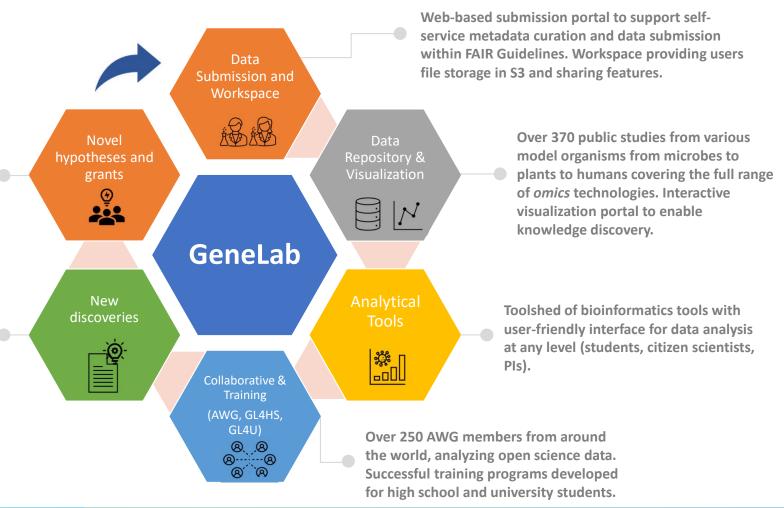


Overview

Open access data enables discovery of new hypotheses and new ideas for grant proposal. Data from those new research experiments are generated and deposited back into GeneLab.

GeneLab has enabled 40 new publications re-using data and performing meta-analysis.



371

Studies

422

Datasets

45

Species

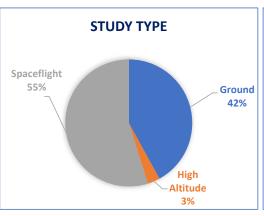
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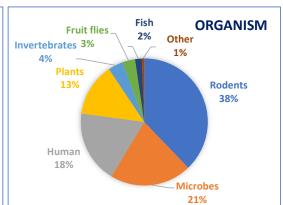
Assays

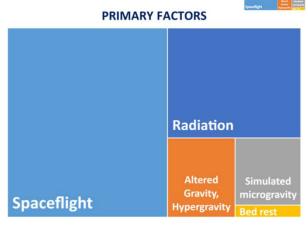
>135TB

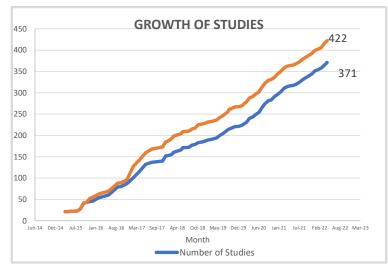
Data

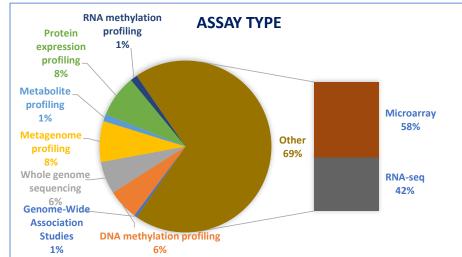
GeneLab Data Repository











Re-use of Data and Enabling New Discoveries

40 enabled publications (10 publications produced by the AWGs) using data available in GeneLab.

Mammalian and Invertebrate Models as Complementary Tools for Gaining Mechanistic Insight on Muscle Responses to Spaceflight

```
by ① Thomas Cahill 1 💆 ② Henry Cope 2 🖾 ③ ② Joseph J. Bass 3 🖾 ③ ② ② Eliah G. Overbey 4 💆 ② Rachel Gilbert 5.6 💆 ② Willian Abraham da Silveira 1.7 🖾 ⑤ ② Amber M. Paul 5.8.9 ⑤ ② ② Tejaswini Mishra 10 💆 Raúl Herranz 11 💆 ② Sigrid S. Reinsch 5 🖾 ⑤ ③ Sylvain V. Costes 5 🖾 ⑥ ② Gary Hardiman 1.12 🖾 ⑥ ② Nathaniel J. Szewczyk 3.13 🛣 ⑥ and ② Candice G. T. Tahimic 5.14.* 🖾
```

An Integrative Network Science and Artificial Intelligence Drug Repurposing Approach for Muscle Atrophy in Spaceflight Microgravity



Article
Knowledge Network Embedding of Transcriptomic

Knowledge Network Embedding of Transcriptomic Data from Spaceflown Mice Uncovers Signs and Symptoms Associated with Terrestrial Diseases

```
Charlotte A. Nelson <sup>1</sup><sup>(0)</sup>, Ana Uriarte Acuna <sup>2,3</sup>, Amber M. Paul <sup>2,4</sup><sup>(0)</sup>, Ryan T. Scott <sup>2,3</sup><sup>(0)</sup>, Atul J. Butte <sup>5,6</sup><sup>(0)</sup>, Egle Cekanaviciute <sup>2</sup><sup>(0)</sup>, Sergio E. Baranzini <sup>1,5,7</sup>, <sup>8</sup><sup>(0)</sup> and Sylvain V. Costes <sup>2,8</sup><sup>(0)</sup>
```



Computational and Structural Biotechnology Journal

Volume 19, 2021, Pages 2223-2235



Reanalysis of the Mars500 experiment reveals common gut microbiome alterations in astronauts induced by long-duration confinement

N.J.B. Brereton a 21 , F.E. Pitre a, 1 , E. Gonzalez b, c, 1

Rad-Bio-App: a discovery environment for biologists to explore spaceflight-related radiation exposures

Richard Barker , Sylvain V. Costes, Jack Miller, Samrawit G. Gebre, Jonathan Lombardino & Simon Gilroy

npj Microgravity 7, Article number: 15 (2021) | Cite this article

Cell: The biology of spaceflight package

A coordinated package of 29 scientific papers published in five *Cell Press* journals featuring **9** papers utilizing data or resources in GeneLab. *High impact research highlights:*

- Comparative Transcriptomics Identifies Neuronal and Metabolic Adaptations to Hyper gravity and Microgravity in Caenorhabditis elegans, iScience
- Comprehensive Multi-omics Analysis Reveals Mitochondrial Stress as a Central Biological Hub for Spaceflight Impact, Cell
- NASA GeneLab RNA-seq consensus pipeline: standardized processing of short-read RNA-seq data, iScience





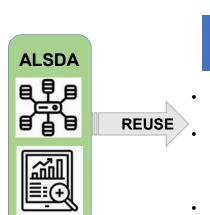
In 2021, the Ames Life Sciences Data Archive (ALSDA) transitioned to use the GeneLab Data Systems. The goal of this integration was to develop a multi-project submission portal to reduce the burden on PIs submitting data and enabling discovery of both omics and phenotypic data.

Raw, Processed Data

Assay, Sample Metadata

Mission, Hardware Metadata

Environmental, Telemetry Data



Open Science Data Repositories

- Phenotypic-Physiological-Behavioral-Imaging-Level Data
- Mission Telemetry data from spacecraft and hardware associated to experimental studies
- Federated with GeneLab
 (Molecular Omics-Level Data)

(Images from Ronca et al., 2019 https://doi.org/10.1038/s41598-019-40789-y; Cells Bone, RR Habitat NASA-ARC)

Scalability of Data

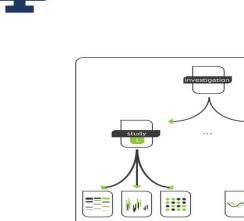
GeneLab was developed to be scalable – both for data storage and new data types.

Storage:

- Utilizing cloud for data systems development and data storage
- Cloud provides instant increase in storage
- Allows any data file type

Data:

- Configurable data model to capture any type of experimental data
 - Investigation/Study/Assay (ISA) tab-delimited (TAB) format
- Link multiple assays by sample name
- Not limited to -omics assays
- Configure metadata templates to include required fields
 - Qualitative or quantitative measurements (data)
 - Space-relevant fields (for example, radiation dosimetry data per sample)
 - Meets the minimum required information for assays (MIAME, MIxS, MIAPE)
- Machine-readable format JSON



Omics – new technologies and data types in constant development

In the recent years, new omics technologies have matured such as single cell and spatial omics. Metadata standards were already available and GeneLab was easily able to curate the metadata and organize the files.



Single cell transcriptional profiling of peripheral blood mononuclear cells (PBMCs) from mice flown on Rodent Research Reference Mission-2 (RRRM-2)

Organisms	Factors	Аввау Турев	Release Date	Description
Mus musculus	Spaceflight	transcription profiling	12-Aug-2021	In the Rodent Research Reference Mission (RRRM-2), forty female C57BL/6NTac mice
	Age			were flown on the International Space Station. To assess differences in outcomes due to
				age, twenty 12 week-old and twe



Spatially resolved transcriptional analysis of hearts from mice flown on the RR-3 mission

Organisms	Factors	Авзау Турев	Release Date	Description
Mus musculus	Spaceflight	Insrescription profiling	18-Mar-2020	The Rodent Research-3 (RR-3) mission was sponsored by the pharmaceutical company
				Eli Lilly and Co. and the Center for the Advancement of Science in Space to study the
				effectiveness of a potential coun

As new technologies emerge, the GeneLab curation team can create new assay configuration to capture the minimum requirement metadata for each technology. Data standards are provided through standards consortiums and/or scientific community consensus.



Standards Consortiums

For omics, many standards for the minimum information about a specific assay experiment exist. For example:

- MIAME Minimum Information About a Microarray Experiment
- MIAPE Minimum Information About a Proteomics Experiment
- MIxS Minimum Information about any (X) Sequence
 - MIGS for genomes
 - MIMS for metagenomes
 - MIMARKS for marker genes
- ENCODE RNAseq experiments

GeneLab uses these standards to ensure data is well curated and complies to the FAIR principles (Findable, Accessible, Interoperable, and Reusable)

Scientific Community Consensus

With the support from our Analysis Working Groups (AWGs), we have developed metadata standards:

- Spaceflight metadata fields by organism type
- Radiation specific metadata fields, including co-developing the Radiation Biology Ontology

ALSDA AWG has contributed their expertise to establish a consensus on standards for phenotypic experiments including assay, sample, and study design metadata which must be collected from PIs to **ensure data**

reusability.

	ALSDA Assay Metadata, Setup, Outcome Measure Configuration for Barnes Maze	Barnes Mase			
File Folders will contain: Study Metadata File, microscope Assay, log file [EEQLIRED], 2D im.	ty Processed Data Outcomes File, Image of Barnes Man Image of Avention device, Image of the Room, Raw Tr	ALSDA Assay Metadata, Image, Outcome Measure	Micro-Computed Temperasthy (microCT) uCT)		
Supporting Literature:	Session Video, Raw Testing Session Video	Configuration for microCT			
	Supporting Literature: Barnes, Neuroscience, 1994; DOI: 10.1523/NEUROSCI.14-10-05793.1994; PMID: 7931545	File Folders will contain: Study Metadata File, µCT Assay, log file (REQUIRED), 2D & 3D images	Measurement: Bone Microstructure Ontology: http://purl.jp/bio/4/id/200906009687576300		
	British, Rad Res, 2012; PMID: 22077338 DOI: 10.1662/v2637.1	Supporting Literature: Bouxsein et al., 2010, JBMR: https://doi.org/10.1002/jbmr.141	Technology: Micro-Computed Tomography Ontology: http://purl.obolibrary.org/abs/MMO_0000570		
Dimensions (XY):	DOI: 10.1667/H2637.1		and the state of t		
Number of 2 sections per image					
Number of T timepoints per image	1	Parameter	Example Value		
Pixels Type:	Parameter	NOTE: DATASET FROM ONE TISSUE	e.g. Fomue		
Pixels Size (XYZ) (µm):		ALSDA Assay Metadata Configuration for Micro-Computed To			
Channels		THE PERSON NAMED IN COLUMN NAM	IMAGE SCAN ACQUISITION		
	Other Behavioral assays conducted prior or concurre	Scanner (Name/Company/Version#)	e.e. SkyScan1174v2		
	after the Sames (free text) —	Volume of Interest Location Pires test?	e.g. Cortical mid-diaphysis. Cancellous metaphysis		
	Vector of the sequence of all behavioral tests perform		e.e. 984 um		
	order, denoting position of Survey (free text)	Volume of Interest Size (unit: micrometers)	e.e. saline, air. PBS, ETCH, etc.		
Platform	Between Voctor, how much time between assays	Scan Medium (free text)			
Number of samples per position	Interval between habituation and acquisition training	Contrast Stain Applied (free text or No)	e.g. Hexabrix, Barium sulfate, Osmium tetroxide, Iomeprol		
Samole metadata	sessions (minutes, hours or days)		eg. 12 µm		
Jerryre micasara	Prior habituation to the platform (8 mins per trial, 8 a	Kilovolt Peak (unit: kilivolt)	eg. 24 NV eg. 145 mA		
Number of biological markers	triefs per-day, if days)	X-ray Intensity (unit: milliampere) Integration Time Exposure (unit: milliseconds)	e.g. 545 mA e.g. 5000 ms		
Marker type	Barnes Assay Repeated Lunit: YES/NO				
Molecule / structure labeled	Viverjurg flastige Jepsign (verulnus)	Frame Averaging (unit: number)	e.g. 4		
Malecule / structure labeled	4 m 6.8 m 20 g / 6 h 20 m m m m				
		Filtration Algorithm (free text)	e.g. Gaussian, Laplace-Hamming		
		Segmentation Selection Method (free text)	e.g. Manual, Automatic		
		Segmentation Contour Method (free text)	e.g. Uniform shape Jum away, Irregular adjacent		

Proprietary data

Currently all the data that is published, is openly accessible worldwide. GeneLab has already in place a mechanism for account-based access, for example our Collaborative workspace. This capability can be expanded in the future for:





- Develop a controlled access data portal
- Create an automatic data access request workflow
- Scientists will be able to translate their findings from model organisms to human outcomes



Commercial Space Industry

- Develop a controlled access data portal and an automatic data access request workflow for "closed" data
- Utilize GeneLab infrastructure to collect and host space-relevant data for biological research

Commercial and International Partners

Open access data in GeneLab, accelerates the pace of scientific discovery and thus enables exploration and development of countermeasures by using systems biology approaches to identify cross-species relevance, mechanisms, biomarkers and potential health risks for LEO and beyond LEO (Lunar and Mars Exploration).

To increase usability and accessibility, space biological research should be available through a common portal. It's important to work closely with our commercial and international partners to ensure data across agencies and platforms are harmonized and comparable. In addition, systems already developed can be utilize not duplicating efforts and costs for data sharing.

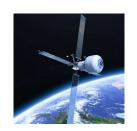
For example, GeneLab already hosts datasets from multiple space agencies (ESA, JAXA, CSA) and from CASIS funded experiments.

In order to continue maximizing the return of spaceflight experiments, we encourage commercial and international partners to utilize the GeneLab Data Systems for their research data, both for open and proprietary data.



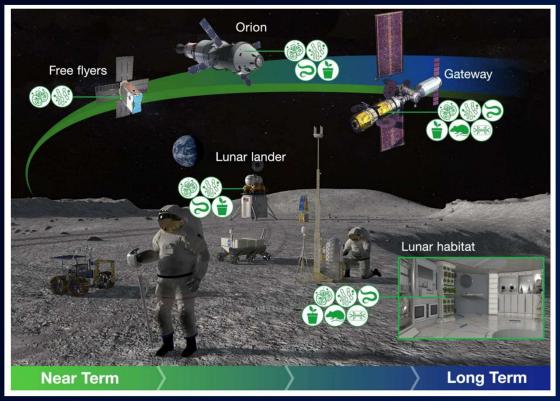






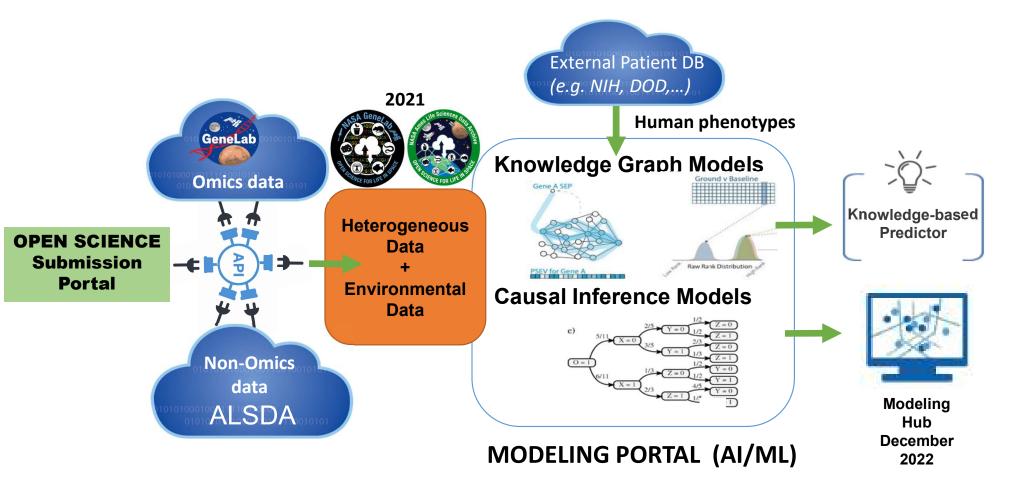


Beyond LEO - Lunar

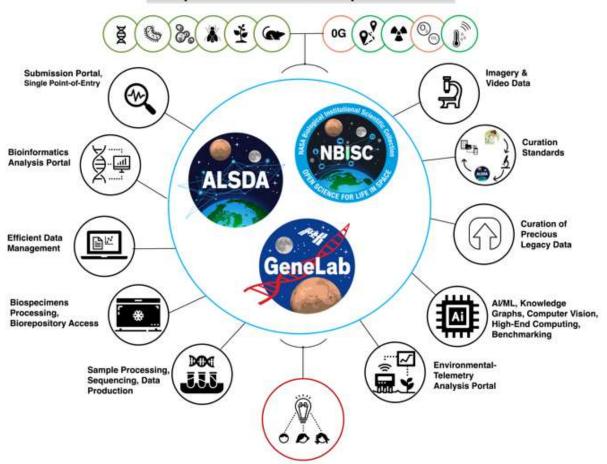


With limited sample return for various platforms, we are preparing new metadata templates and data streams to host and publish data from future lunar experiments and beyond.

From multiple databases to a knowledge-based system



Open Science Data Repositories



New Knowledge; Faster Pace; Inclusive & Diverse Access

Big Picture

AI/ML Modeling

-Predictive -Hypothesis Driver -Countermeasure Repurposing

Tools

-Computational Analysis -Cross-Experiment Analysis -Meta-Analysis -Data Visualization -Computer Vision/Transformers

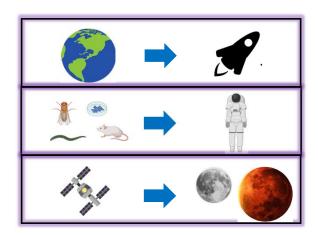
FAIR & Open Data

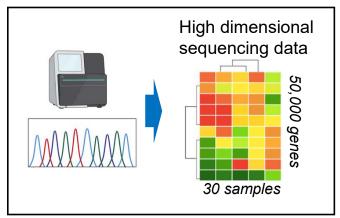
-Metadata: Investigation, Study, Assay
 -Outputs: Raw, Processed; Tabular, Images, Video
 -Mission-Payload: Environmental, Telemetry

Challenges for Machine Learning in Space Biology

Space Biology Challenges

- Low sample size n
- High dimensionality D
- Heterogeneous data
- Sparse data
- Out-of-distribution generalization the testing distribution is unknown and different from the training
 - (Earth -> space, mouse -> human, short term -> long duration spaceflight)



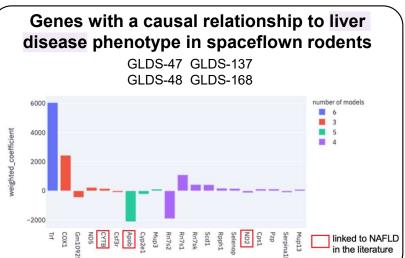


G	ene expressior matrix	SNP matrix	Drug treatment	Environmental variables	Histology
Sample 1 Sample 2					
Sample n					

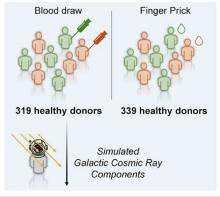
Causal inference in biological systems

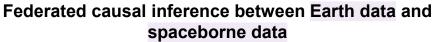
Causal Relation Inference and Search Platform (CRISP) /FDL

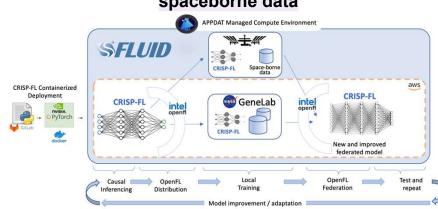




Genetic variants with a causal relationship to DNA damage and radiation sensitivity in human irradiated immune cells

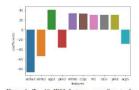


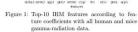




2021 FDL Astronaut Challenge /FDL

A novel paradigm for generating humanrelevant biomedical insights from observational datasets with limited size by leveraging and augmenting with animal model data





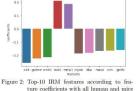


Figure 2: Top-10 IRM features according to fea-

Al-readiness and formatting standards: Benchmark datasets for space biology

RNA sequencing dataset

- -RNA-seq data quantifies all expressed genes in a sample
- -Classic example of high-D (~50k genes), low-N dataset

Generator Model

Generated Example

Discriminator Model

Update model

Binary Classification RealFake

Approach:

- 1.Start with real RNA-seq data from GeneLab
- 2.Generate synthetic RNA-seq data using generative adversarial network (GAN)
- 3.Benchmark dataset will be high-D and high-N (synthetic)

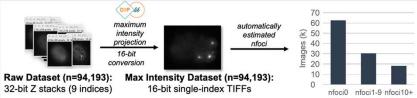
ML applications: e.g. causal inference to identify causal genes with relation to a pathogenic target variable

Microscopy dataset

-Huge amounts of microscopy data in space biology are time consuming to manually annotate through expert review

Approach:

-Mouse radiation exposure microscopy dataset with DNA damage events as distinct foci (PI: Sylvain Costes)



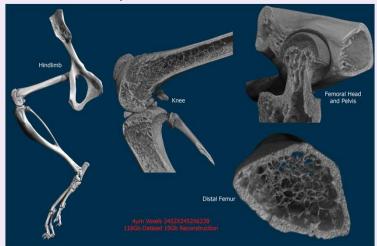
ML applications: e.g. train a self-supervised classifier to detect number of DNA damage foci; or to detect radiation tracks through cells; or to classify images based on the type of radiation.

Bone Computed Tomography (CT) dataset

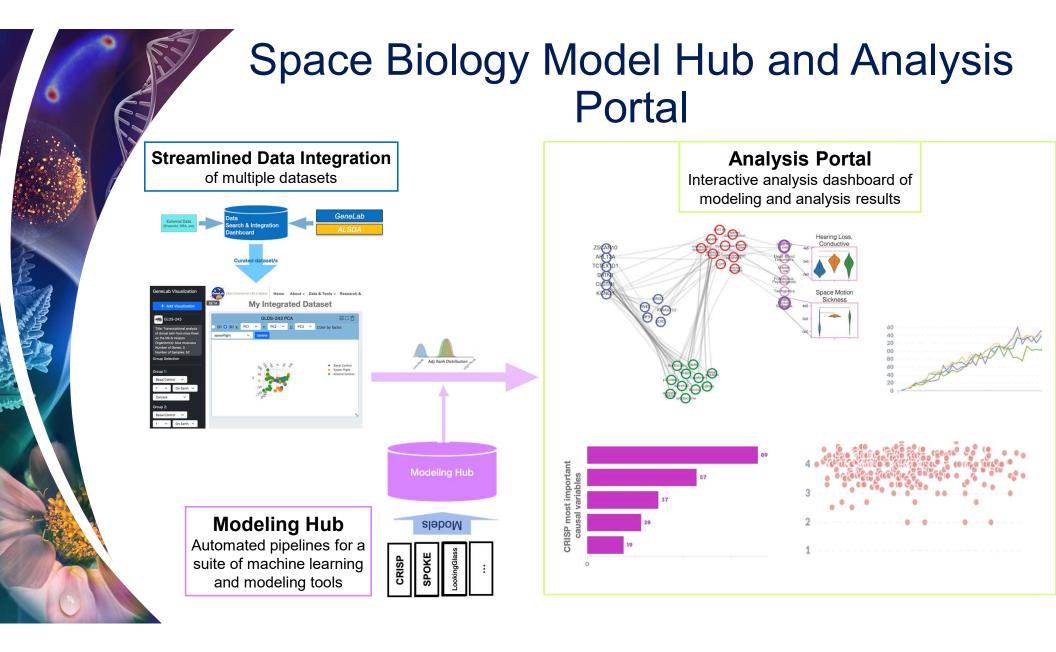
-CT scan is a key assay in space biology to assess bone changes in spaceflight

Approach:

-Mouse hindlimb CT dataset from spaceflight or hindlimb unloading (PI: Eduardo Almeida)



ML applications: e.g. train a classifier to detect the type of stressor based on bone loss, to predict future bone loss when exposed to that stressor.



Leading the Path to Open-Source Science

2026



Transform to Open Science (TOPS) is a \$40 million* 5-year NASA Science Mission Directorate mission

Objectives:

- ★ Increase understanding & adoption of open science.
- ★ Accelerate major scientific discoveries.
- ★ Broaden participation by historically underrepresented communities.

2027

Goals for 2027:

- ★ 20K earn Open Science Badge
- ★ 5+ major discoveries
- ★ Increase participation of underrepresented groups by 2x

2023

Year of Open Science

*pending appropriations



Training the Next Generation of Scientists



GeneLab for High Schools (GL4HS): A four-week intensive training summer program for rising high school juniors and seniors to learn bioinformatics and computational biology methods and techniques to analyze space omics data.

Learn more and apply at: https://www.nasa.gov/ames/genelab-for-high-schools



GeneLab for Colleges/Universities (GL4U): For educators and students to learn how analyze omics data using GeneLab standard pipelines and space-relevant data

Access to course materials: https://github.com/nasa/GeneLab-Training/tree/main/GL4U



Space Life Sciences Training Program (SLSTP): Provides undergraduate students entering their junior or senior years, and entering graduate students, with professional experience in space life science disciplines.

Learn more and apply at: https://www.nasa.gov/ames/research/space-life-sciences-training-program



Spaceflight Technology, Applications, and Research(STAR): The annual course targets principal investigators (PIs), senior research scientists, and postdoctoral scholars and aims to facilitate their entry to space biology and preparation for conducting spaceflight experiments using NASA and commercial platforms.

Applications open until May 30th: https://science.nasa.gov/biological-physical/programs/star



NASA Postdoctoral Program: If you're an early-career or senior scientist, apply to the NASA Postdoctoral Program to help pursue NASA's mission and experience the world's most diverse technology and expertise.

Learn more at: https://npp.orau.org/

Near-term Goals

Oct 1^{st,} 2022

Release the Multi-Project
Submission Portal

New Interface and curated phenotypic data (ALSDA)

FY 2023

Release Modeling Hub and Analysis
Portal
Enable discovery of imaging data
Ease data ingest > 1 TB

FY 2024

Develop smart assist submissior features

Automate data stream from lunar experiments

Participate in SMD-Source Science Initiatives – Present opportunities to the BPS scientific community

Continue to ingest and host experimental and mission telemetry from space-relevant experiments

Thank you!



Twitter: @NASAGeneLab https://genelab.nasa.gov



GeneLab is funded by the NASA Space Biology program within the NASA Science Mission Directorate's (SMD) Biological and Physical Sciences (BPS) Division



































Open Science for Life in Space is funded by the NASA Space Biology program and NASA Human Research Program











NASA Biological Open Science Resources

Biospecimen Sharing Program (BSP)



- Dissects and preserves rodent tissues from Flight and Ground investigations
- Coordinates internal tissue sharing

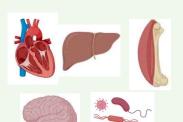




NASA Biological Institutional Scientific Collection (NBISC)



 Collection of non-human specimens and space microbial culture



Ames Life Sciences
Data Archive (ALSDA)



 Collects and curates physiological, mission, project and imaging data





GeneLab (GL)



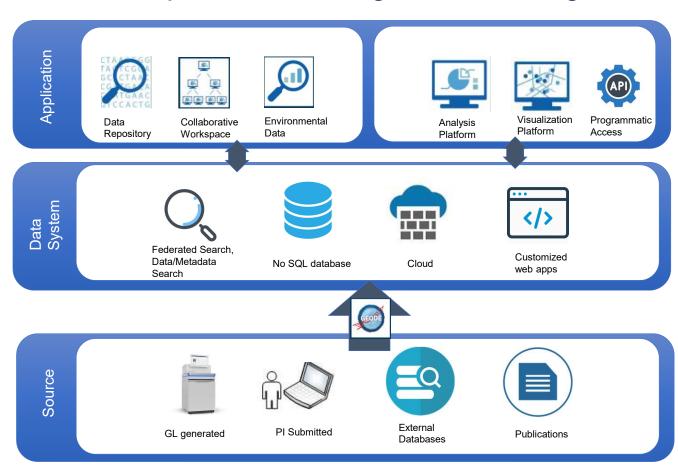
 Collects and curates omics data





NASA BPS Open Science Enterprise Solution: genelab.nasa.gov

- Open access data
- FAIR (Findable, Accessible, Interoperable, Reusable)
- Controlled access tools
- API internal and external
- User Friendly Interface
- Tutorials
- Self-service Submission Portal
- Federated search GEO, PRIDE, MG-RAST, ALSDA
- Database & Cloud Scalable, easy access, fast
- Web apps
 - Data Access & Management
 - Security
 - Operation
 - Governance and Integration
- Open Source software no maintenance cost for software
- Multiple data sources
 - · Standard metadata organization
 - Open file formats



Omics Data Generation

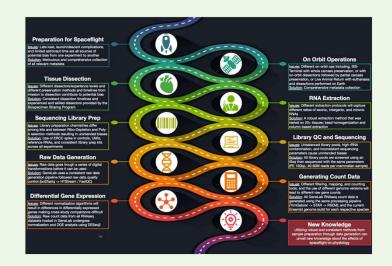
Maximizing spaceflight experiments by generating omics data without <u>any propriety time</u> for open science.

- Maximizing access to spaceflight data through tissue sharing efforts.
- Upon curation, these data are released *immediately* to the public through the GeneLab data system.
- To date, 59 studies are available including data from: Rodent Research missions and Plant experiments. Assays include:
 - Transcriptomics
 - Bulk RNASeq
 - Single Cell RNASeq
 - Spatial Transcriptomics
 - Epigenomics
 - Proteomics
- Enabling meta-analysis publications



Standardizing Sample Processing and Sequencing for Spaceflight Samples

- GeneLab also works with NASA-funded principal investigators (Pl's) to generate proprietary data using GeneLab standard assays.
- Optimized processing protocols and high-quality data outputs
- Data Processing services
- Request quote: https://genelab.nasa.gov/form/genelab-sequencing-services



GeneLab Power Users

GeneLab

GeneLab Analysis Working Groups (AWGs) consist of 250+ scientists from multiple space agencies, international institutions, and industry. Scientists meet monthly with each group to analyze data in the GeneLab repository.

We invite you to join - https://genelab.nasa.gov/awg/join!

ANIMAI

68 members

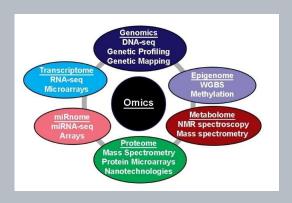
Facilitates the use of omics in understanding basic mechanisms by which animals and constituent tissues and cells adapt to the spaceflight environment.



MULTI-OMICS

128 members

Interactions between the different omics to provide complete understanding of the entire system begin studied.



PLANTS

58 members

Share and discuss the latest developments in **Astrobotany** – the discipline of botany concerned with interactions between plant biology and space environment.

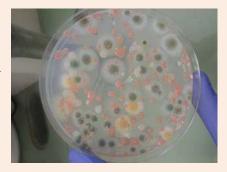




MICROBES

50 members

Focuses on analyzing microbial datasets within GeneLab that includes gene-expression, proteomic, metabolomic and environmental metagenomic datasets.



Accelerating the pace of scientific discovery through open data

- GeneLab has established the AWGs with the goal of maximizing the generation of new knowledge from these rare and complex spaceflight datasets. With over 250+ scientists and experts worldwide the four working groups focus Animal, Plants, Microbe and Multi-omics strategies.
- Since 2018, the AWGs have published 10 peer-reviewed publication re-using data in GeneLab:
- Mammalian and Invertebrate Models as Complementary Tools for Gaining Mechanistic Insight on Muscle Responses to Spaceflight, International Journal of Molecular Sciences
- Immunological and hematological outcomes following protracted low dose/low dose rate ionizing radiation and simulated microgravity, Scientific Reports
- NASA GeneLab RNA-seq consensus pipeline: standardized processing of short-read RNA-seq data, iScience
- NASA GeneLab RNA-seq consensus pipeline: standardized processing of short-read RNA-seq data, Cell System
- Comparative Transcriptomics Identifies Neuronal and Metabolic Adaptations to Hypergravity and Microgravity in Caenorhabditis elegans, iScience
- Comprehensive Multi-omics Analysis Reveals Mitochondrial Stress as a Central Biological Hub for Spaceflight Impact, Cell
- Fundamental Biological Features of Spaceflight: Advancing the Field to Enable Deep-Space Exploration, Cell
- Multi-omics analysis of multiple missions to space reveal a theme of lipid dysregulation in mouse liver, Science Reports
- NASA GeneLab Platform Utilized for Biological Response to Space Radiation in Animal Models, Cancers
- Mice Exposed to Combined Chronic Low-Dose Irradiation and Modeled Microgravity Develop Long-Term Neurological Sequelae, International Journal of Molecular Sciences