
Data Science Methodology Transfer: Space Science to Biomedicine

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June 27, 2019

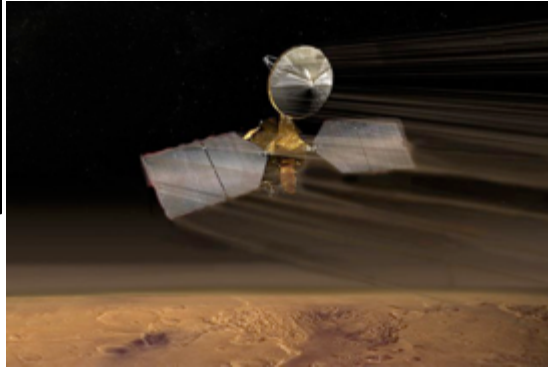


Data Lifecycle Model for NASA Missions

From Onboard Computing to Scalable Data Analytics

Emerging Solutions

- Next-Generation Flight Computing
- Onboard Data Analytics



Observational Platforms and Flight Computing

Scaling Pressures Expose the Need for an Integrated End-to-End Data and Computational Architecture



Emerging Solutions

- Intelligent Ground Stations
- Agile Mission Operations



Ground-based Mission Systems

Emerging Solutions

- Data-Driven Discovery from Archives
- Scalable Computation and Storage



Interactive Analytics and Visualization and Decision Support

NASA Data Archives

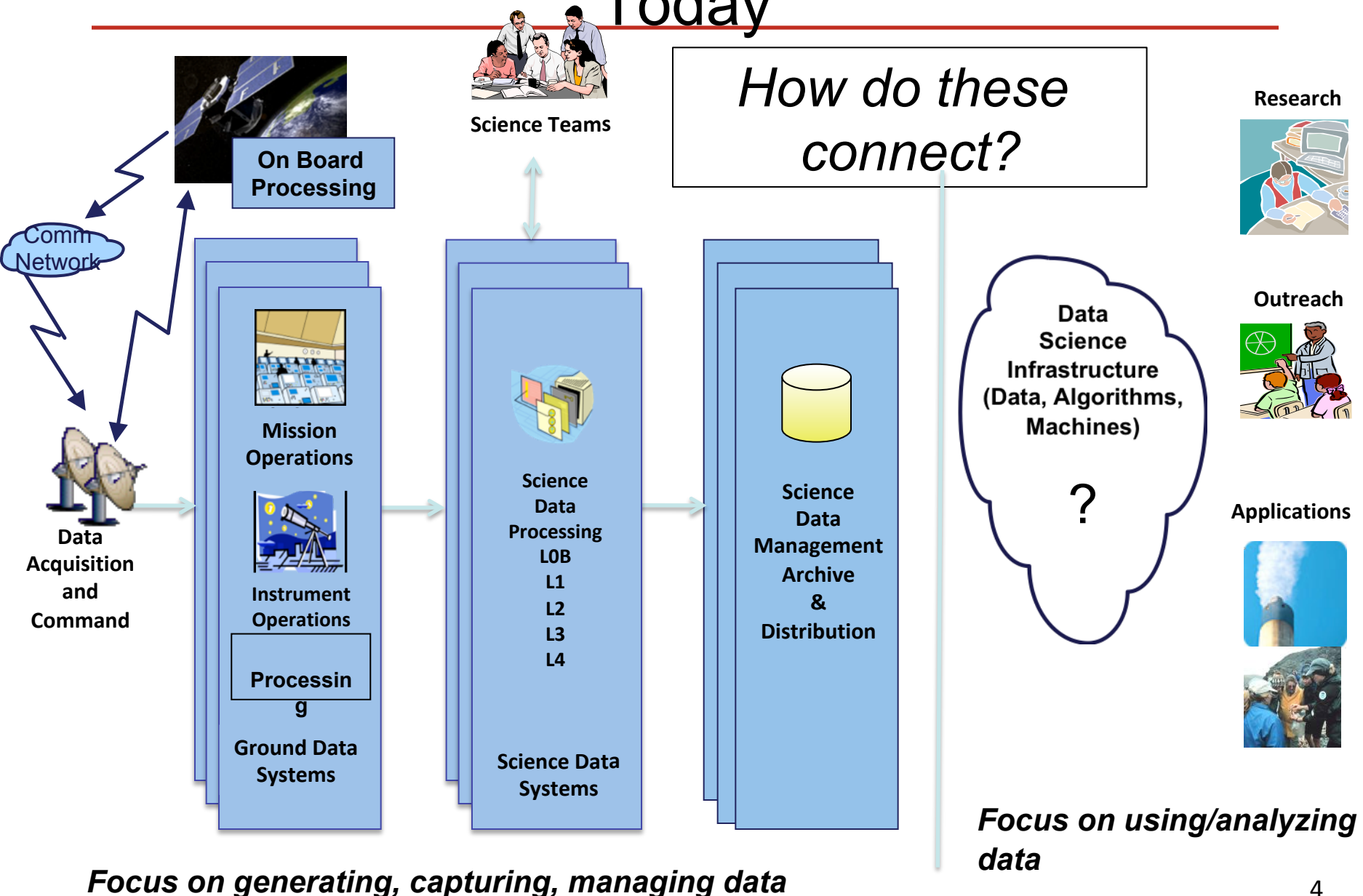
- **NASA captures robust scientific archives of data to support long-term analysis**
 - A requirement on every mission
 - Adheres to specific standards (both in terms of structure + description/metadata)
 - Mandates public access after a specified time period

- **The capture of well-curated, organized data collections is the basis for enabling data analysis**
 - This is a critical precursor step to analysis
 - The scientific community uses these collections as the basis for studies (often grant funded)
 - The development of robust architectures and systems to support data management and data analysis services are emerging

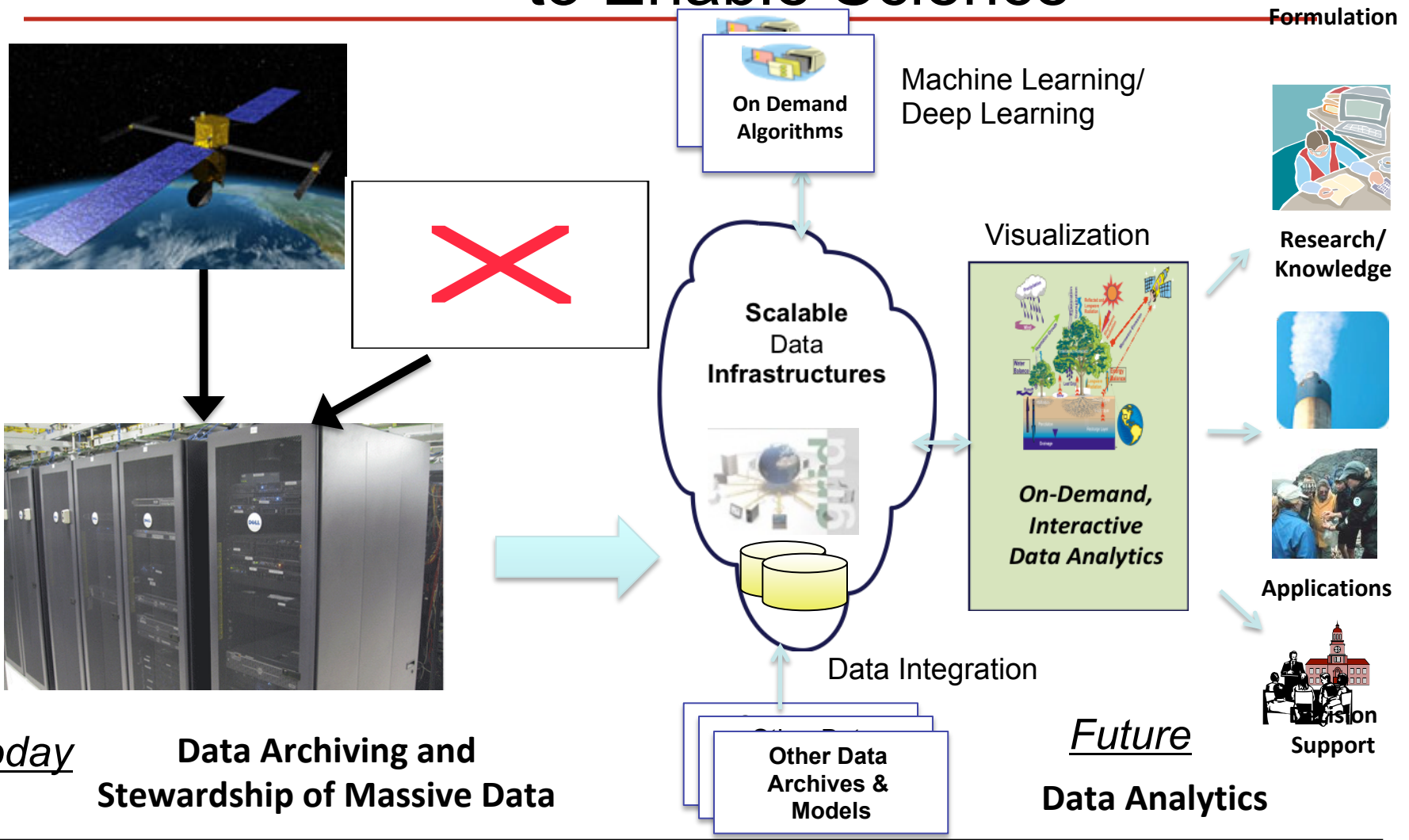
- ***Evolving from research preservation and stewardship towards driving analysis from these archives...***



Planetary Science Data Analytics Support Today



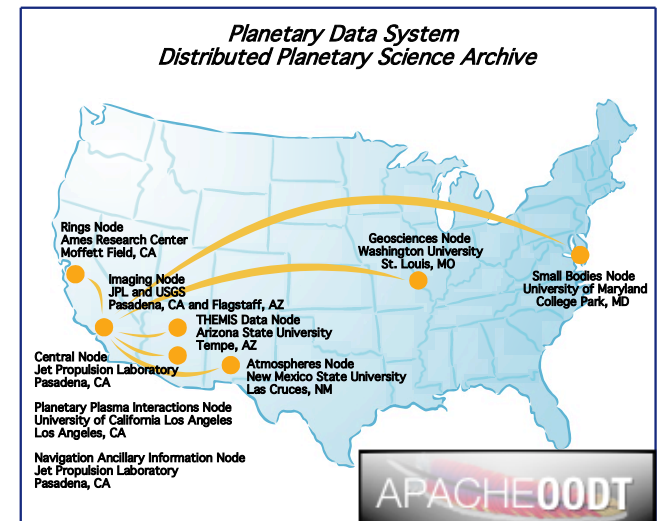
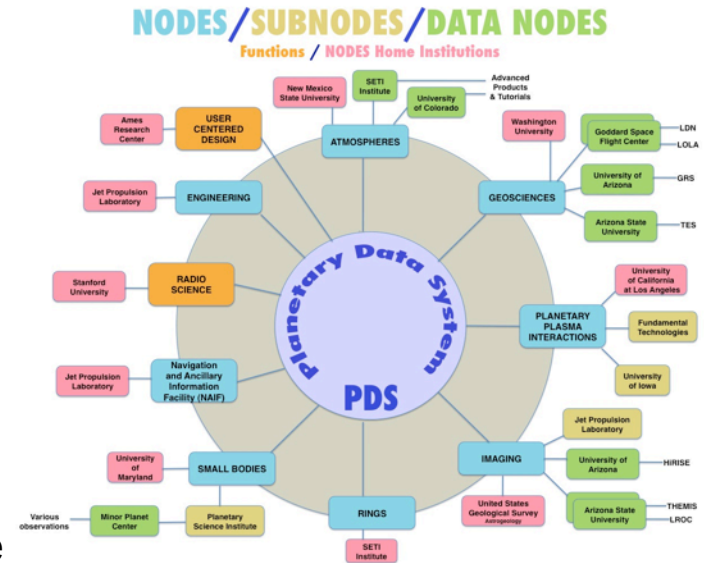
Expanding to Data-Driven Analytics to Enable Science



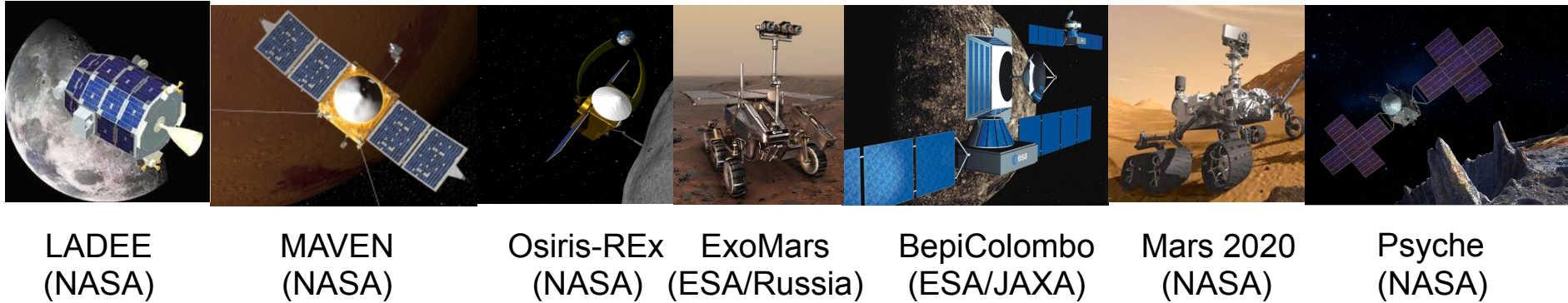
Reducing Data Wrangling: “There is a major need for the development of software components... that link high-level data analysis-specifications with low-level distributed systems architectures.”
Frontiers in the Analysis of Massive Data, National Research Council, 2013.

Planetary Data System

- **Purpose:** To collect, archive and make accessible digital data and documentation produced from NASA's exploration of the solar system from the 1960s to the present.
- **Infrastructure:** A highly distributed infrastructure with planetary science data repositories implemented at major government labs and academic institutions
 - System driven by a well defined planetary science ontology
 - Approximately 1.7 PB of data
 - About 4000 different types of data and 40M data products
 - International adoption
 - NASA's de facto archive for all planetary data



International Collaboration on PDS4 Through IPDA



Endorsed by the **International Planetary Data Alliance** in July 2012 –
<https://planetarydata.org/documents/steering-committee/ipda-endorsements-recommendations-and-actions>


Planetary Image Archiving



National Aeronautics and Space Administration

+ NASA en Español
+ Contact NASA

PDS Data Search



Planetary Image Atlas

NEW SEARCH | DATA PORTAL | ABOUT | HELP | FEEDBACK | HOME

Current Selection

remove all
(x)
ATLAS_MISSION_NAME:mars*science*laboratory
(x) ATLAS_INSTRUMENT_NAME:hazcam
(x) PRODUCT_TYPE:range









Search
(press ESC to close suggestions)


- Mission
- Instrument
- Target
- Product Type
- Lighting Geometry
- Filters
- Lat/Lon Bounding Box
- Time Constraints
- Orbital Mission Constraints
- Landed Mission Constraints
- PDS Archive Constraints
- Landmarks 
- Maps
- Report / Sort View Updates

Results Per Page:

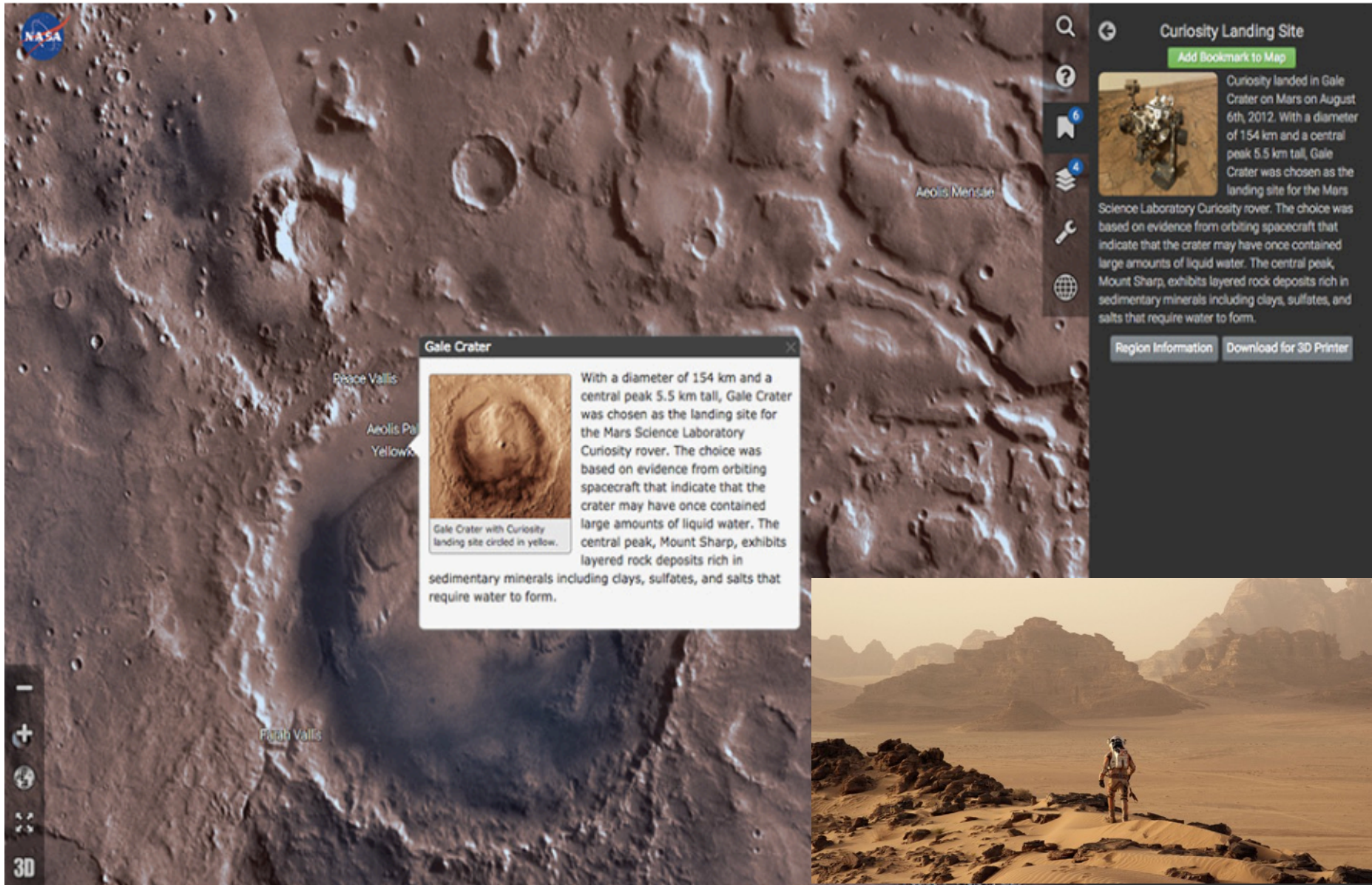
< 1 2 3 ... 1770 1771 > displaying 1 to 24 of 42484

Grid View
Sort View

RRB_491774570RNGLF0482542RHAZ00323M1	   
RLB_491774570RNGLF0482542RHAZ00323M1	   
FRB_491774536RNGLF0482542FHAZ00323M1	   
RLB_491774570RNGLT0482542RHAZ00323M1	   
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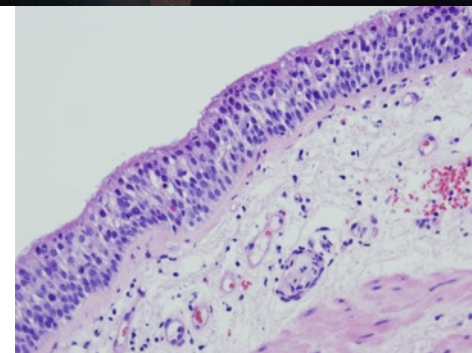


Mars Trek: The Google Earth of Mars



NCI/JPL Informatics Collaboration: Crossing Disciplines to Support Scientific Research

- Development of an advanced Knowledge System to *capture*, process, *share* and support *reproducible analysis* for biomarker research
 - Genomics, Proteomics, Imaging, etc data types of data
- NASA-NCI partnership, leveraging informatics and data science technologies from planetary and Earth science
 - Reproducible, Big Data Systems for exploring the universe
 - Software and data science methodology transfer based on JPL open source technologies and architectures

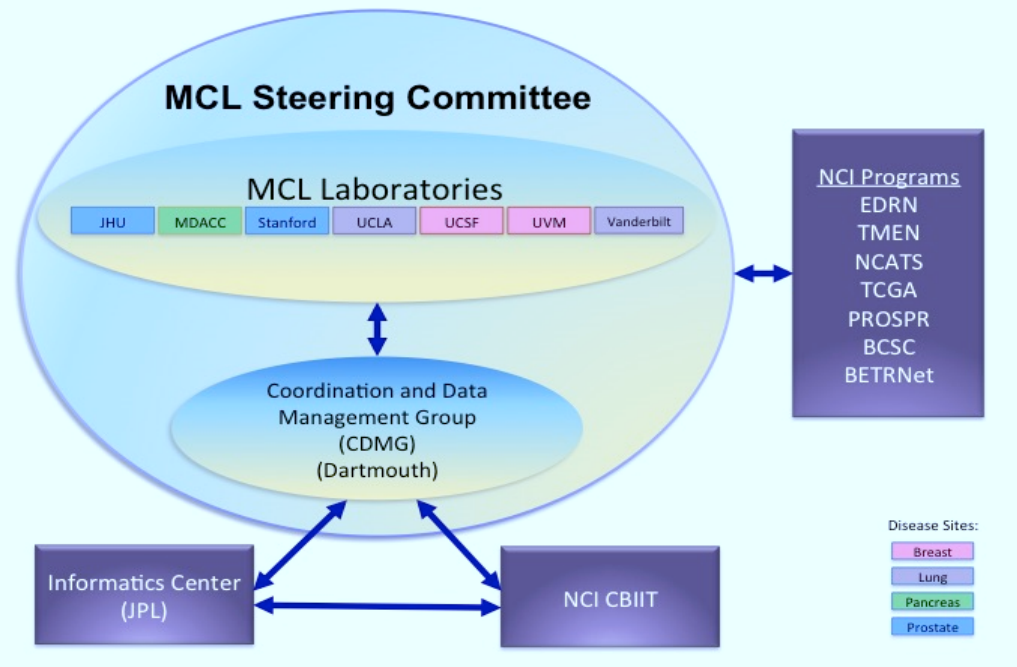


Biomarkers Knowledge Environment

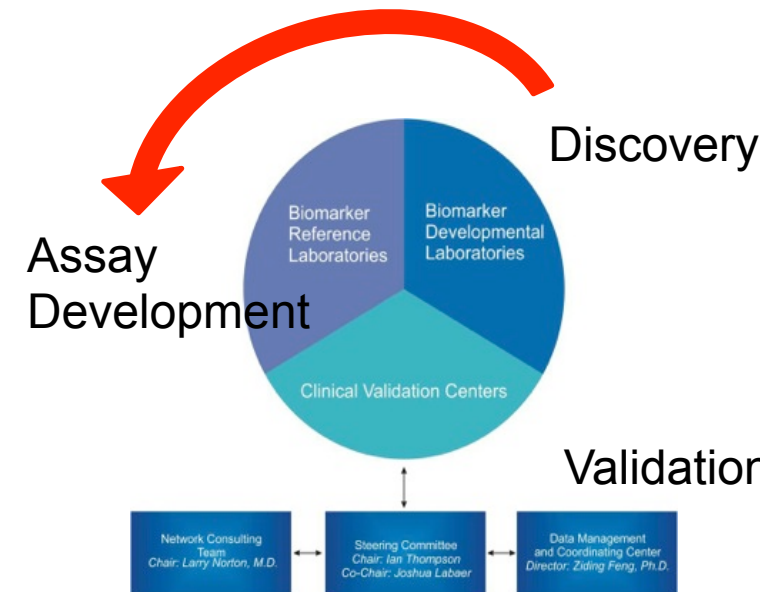
- Integrate diverse research into an online data environment
 - Integrate data as opposed to re-managing data
 - Be agnostic to data formats and structure
- Provide a well architected data management environment that captures, integrates, and shares data for biomarker research including:
 - Biomarkers
 - Biospecimens
 - Validation Study Information
 - Protocol Information
 - Study Results and Data Sets
 - Publications
 - Artifacts supporting collaboration
 - Curated metadata
- Support diverse community needs

Two Key Programs

Organizational Structure of the MCL Consortium



EDRN Organizational Structure



Develop cross-cutting informatics capabilities to support the capture, curation, management, distribution, and analysis of diverse data and results

Capture – Process – Search – Access – Analyze - Visualize

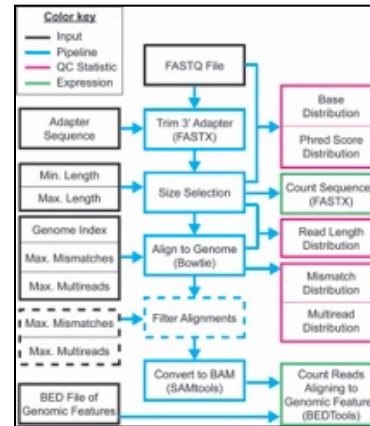
Collection	Lead PI	Organ
Boston University Lung Tumor Sequencing	Arum Spira	Lung
CBIS-DDSM	Rebecca Sawyer Lee	Breast
MD Anderson Pancreas IPMN Images	Anirban Maitra	Pancreas
RNA Sequencing	Chris Amos	Lung
Team 37 CTIP Animal Models	Robert D. Cardiff	Breast

Capture data and metadata

Process reproducibly

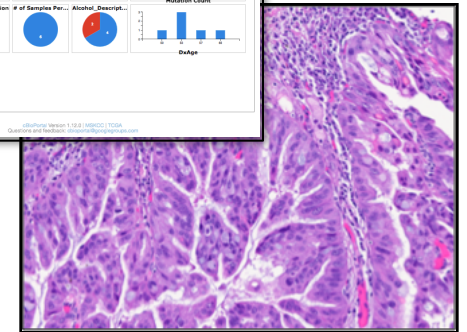
Search Metadata

Access

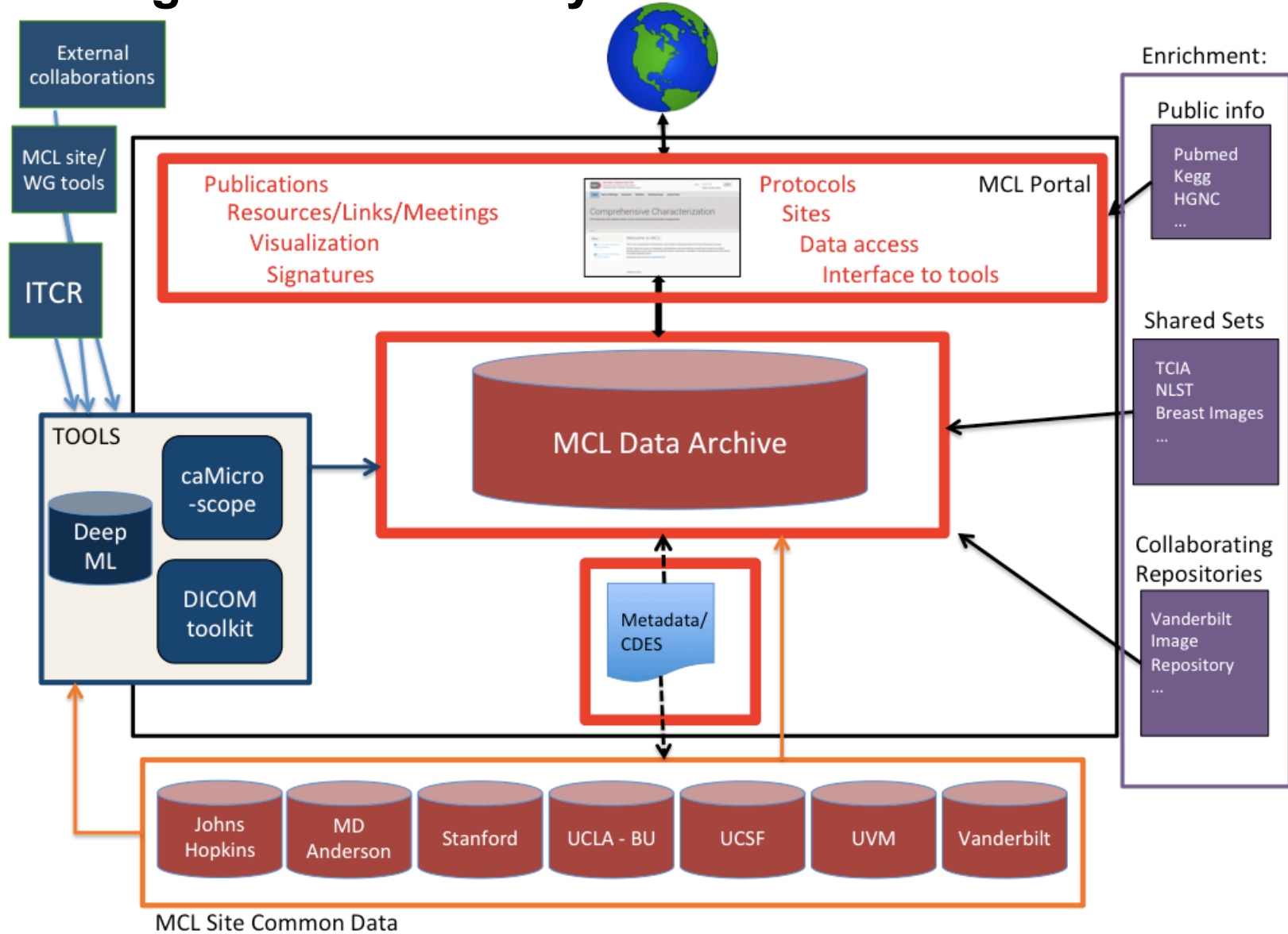


Analyze with algorithms, pipelines

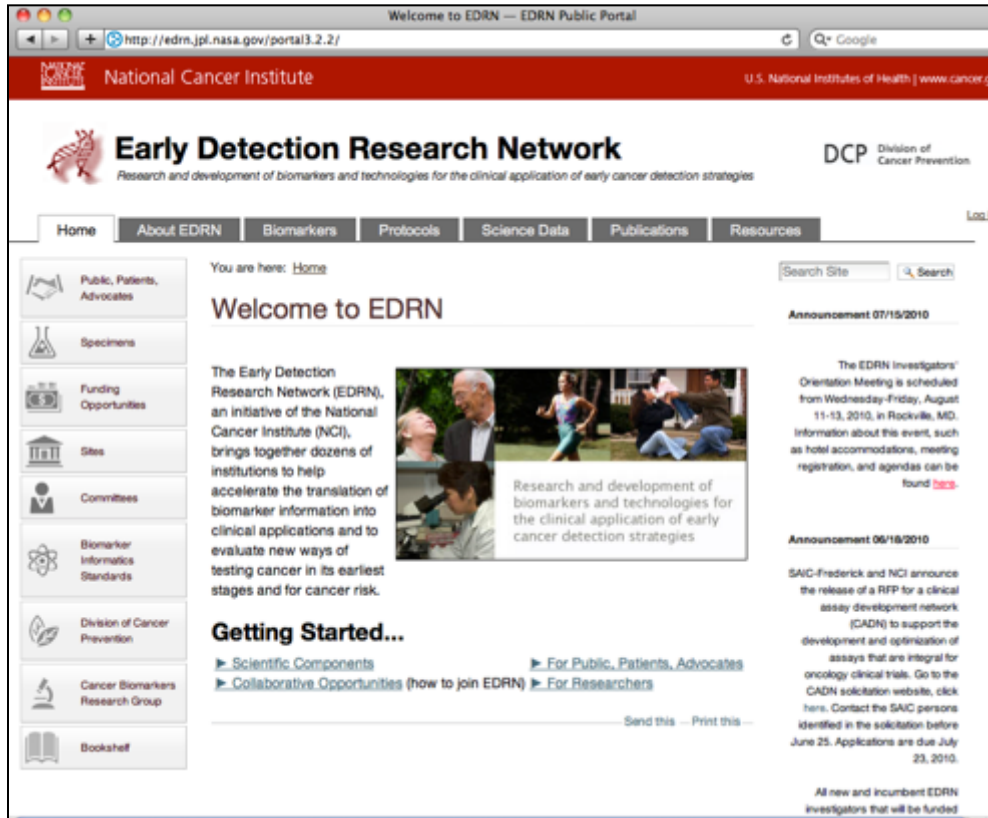
Visualize



MCL Integrated Data Ecosystem Overview



Portal: Dissemination and Access to Biomarker Data



- Gateway to information
- Information managed both within and outside the knowledge system
- Initial starting point for community to get to research data
- Google-like search to access the wealth of data
- Multi-level Security

<http://cancer.gov/edrn>
<http://mcl.jpl.nasa.gov>

Navigating the Knowledge System: Data Semantically Linked

Early Detection Research Network

14-3-3 theta

Validation of Protein Markers for Lung Cancer Using CARET Sera and Proteomics Techniques

PURPOSE: We have implemented a high throughput platform for quantitative analysis of serum autoantibodies which we have applied to lung cancer for discovery of novel antigens, and for validation in pre-diagnostic sera of autoantibodies to antigens previously defined based on analysis of sera collected at the time of diagnosis. **MATERIALS AND METHODS:** Proteins from human lung adenocarcinoma cell line A549 lysates were subjected to extensive fractionation, the resulting 1824

Early Detection Research Network

Validation of Protein Markers for Lung Cancer Using CARET Sera and Proteomics Techniques

Abbreviated Name: Lung CARET

Description: **PURPOSE:** We have implemented a high throughput platform for quantitative analysis of serum autoantibodies which we have applied to lung cancer for discovery of novel antigens, and for validation in pre-diagnostic sera of autoantibodies to antigens previously defined based on analysis of sera collected at the time of diagnosis. **MATERIALS AND METHODS:** Proteins from human lung adenocarcinoma cell line A549 lysates were subjected to extensive fractionation. The resulting 1824 factors were spotted in duplicate on nitrocellulose cast slides. The microarrays produced were used in a blinded validation study to determine whether serum 1, FPGS1, and 14-3-3 theta antigens previously found to be targets of autoantibodies in newly diagnosed subjects with lung cancer are associated with autoantibodies in sera collected at the pre-symptomatic stage and to determine whether additional antigens may be identified in pre-diagnostic sera. Individual sera collected from 85

Early Detection Research Network

Science Data

Captured scientific data results from biomarker studies

The EDNRN is involved in researching hundreds of biomarkers. The following is a partial list of associated results from biomarker research that are currently available for access and viewing. The bioinformatics team at EDNRN is currently working with EDNRN collaborative groups to capture, curate, review and post additional data as it is available. EDNRN also provides secure access to additional biomarker information not available to the public that is currently under review by EDNRN research groups. If you have access to this information, please ensure that you are logged in. If you are unsure or would like access, please contact the curator for more information.

Title	PI(s)	Organ	Protocol	Collaborative Group
Autoantibody Biomarkers	Hansah, Samir	Lung and Upper Aerodigestive	Validation of Protein Markers for Lung Cancer Using CARET Sera and Proteomics Techniques	Lung and Upper Aerodigestive
Barnett S. Esophageal Methylation Profile	Melzer, Stephen	GI and Other	Barnett S Esophageal Methylation Profile	GI and Other

Biomarker Annotations

Protocols

Biomarker Data Results

Early Detection Research Network

Search results

lung biomarker

All Results

- 334 Specimens at Centers for Disease Control
- 334 matching specimens at Centers for Disease Control. last modified Aug 20, 2010 01:24 PM — [Reference 100%](#)
- Research 3-marker panel for Lung Cancer
- The EDNRN validation study ("Validation of Protein Markers for Lung Cancer Using CARET Sera and Proteomics Techniques") presents evidence for the occurrence... last modified Jul 23, 2010 02:16 PM — [Reference 81%](#)
- New York University School of Medicine
- Clinical Epidemiology and Validation Center last modified Jun 23, 2010 01:03 PM — [Reference 85%](#)
- Specimen Reference Sets
- Documentation, EDNRN guidelines, and application forms for specimen reference sets last modified Jun 16, 2010 03:04 AM — [Reference 80%](#)
- 14-3-3 theta
- 14-3-3 theta belongs to the 14-3-3 family of proteins which mediate signal transduction by binding to phosphotyrosine-containing substrates. This highly conserved... last modified Jul 23, 2010 02:16 PM — [Reference 88%](#)
- hL1
- hL1, also known as PAR6.7, belongs to the p190Cas C65 family of proteins. It acts as a positive regulator of anion-gate receptor-dependent transcription. It... last modified Jul 23, 2010 02:16 PM — [Reference 87%](#)

Early Detection Research Network

Welcome to EDNRN

Getting Started...

- Scientific Components
- Collaborative Opportunities Show to join EDNRN. For Scientists

Early Detection Research Network

Autoantibody Biomarkers

Dataset Metadata:

Protocol Name: Validation of Protein Markers for Lung Cancer Using CARET Sera and Proteomics Techniques

Principal Investigator: Samir Hansah

Site Name: Fred Hutchinson Cancer Research Center (Biomarker Developmental Laboratories)

Data Custodian: Ji Qiu

Organ: Lung

Organ Collaborative Groups: Lung and Upper Aerodigestive

Method: Proteins from human lung adenocarcinoma cell line A549 lysates were

1-7 of 2 Products Associated With This Dataset:

- [\(By\) Bench14XFLR_DD_840.pdf](#)
- [\(By\) Bench14-3-3.pdf](#)
- [CARET Lung cancer cells](#)
- [\(By\) BenchNDI-1.pdf](#)
- [\(By\) BenchLAMR1.pdf](#)
- [\(By\) BenchPMS1.pdf](#)
- [\(By\) Bench14-3-3-3.pdf](#)

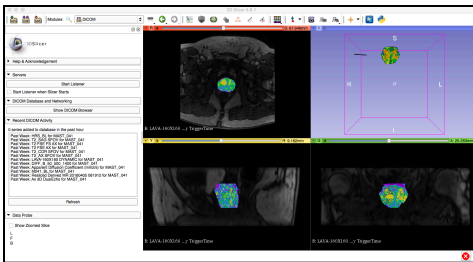
Specimens

Linked through Public Portal

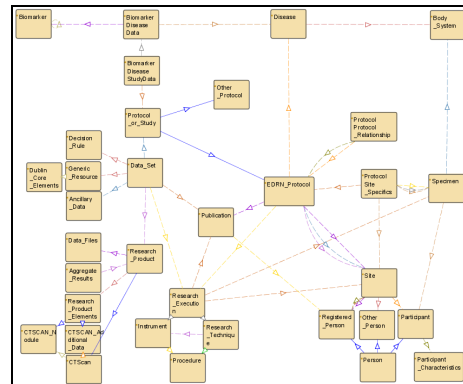
Access to download data

Data Models and Elements

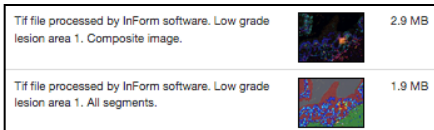
Data generated in the course of research from any source



Accession	Subject	FR_00_00	FR_00_83	FR_00_84	FR_09_18	FR_15_19	FR_15_44	FR_00_00n	FR_00_83n	FR_00_84n	FR_09_18n	FR_15_19n
0	70084023	2403	8010	15284.5	3719	5024.3	809	-0.3486	1.87475	1.1082	0.02037	0.81879
0	7011430	1233.3	2119	2324.5	1602.5	839	1514.5	0.977455	-0.49844	-0.54463	-0.38336	0.15133
0	7013128	403	6433.5	3718	1293.5	1100	2398.5	-0.8212	-0.1887	-0.28054	0.26305	-0.4057
1	7094600	161	3285	4881	1039.5	377	1722	-0.88173	-0.19813	-0.11232	-0.27763	-0.32787
0	7118015	2370	3123.5	3364	1833	2743	3872	2.55053	-0.1878	-0.40566	0.20201	0.34933
0	7119803	337.5	2836	3158	1274	2008	829	-0.38403	-0.30854	-0.43473	-0.62358	-0.14387
1	7121940	493	4220.5	4823.5	2871.5	1151.5	3028.5	-0.2054	-0.23528	-0.3125	0.19177	-0.8814
1	7177082	372	7531	7860.5	1713.5	810	1068.5	-0.0836	-0.0683	-0.08881	-0.35124	-0.49182
1	7186911	409.5	4625	4332	2182.5	3788.5	1325.5	-0.45147	0.15012	-0.23983	-0.056	-0.47628
1	7190010	520	4744.5	6506	1237.5	2792	4934	-0.27308	0.16976	0.15737	-0.65263	0.132082
0	7192723	96	3843.5	4933	7893.5	318	331.5	-0.78125	-0.58951	-0.57623	-0.01167	-0.07068
0	7201841	313	4445.5	3986.5	1619	2173	1717.5	-0.626	0.160459	-0.3731	-0.41177	-0.08279
1	7217022	986	1387	2233.5	2045.5	1006.5	1725.5	-0.21396	-0.08651	-0.26985	-0.37882	-0.42368
0	7217417	284.5	2005	2833	772	306	1309.5	-0.73373	-0.62751	-0.5278	0.46452	-0.67254
0	7224264	414	1388.5	1749	1468.5	2726.5	1975.5	-0.43308	-0.09106	-0.68423	-0.30878	-0.135468
0	7224878	242.5	3937	8163	1482.5	847.5	805	-0.74619	-0.09274	-0.60749	-0.49795	-0.55234
1	7227598	380	899.5	19410	1200	848	835	-0.48643	0.74831	2.44061	0.64473	-0.35148
1	7234123	295	3144.5	3390	1370	3094	1335	-0.65688	-0.23431	-0.28768	-0.19017	-0.28379
1	7274855	747.5	6414	4133.5	830.5	3197.5	3197.5	-0.17889	-0.23846	-0.27972	1.38847	-0.48243
1	7274713	1882	4888	4823.5	4324	3181.5	3220	1.84889	-0.28182	-0.30119	-0.68841	0.20212
0	7281875	502	2022	3275.5	813.5	971	681	-0.81264	-0.1022	-0.46488	-0.83381	-0.68287



Data linked across the Data Commons



Instruments, etc.

Organ	Title	PI(s)	Organ	Protocol	Collaborative Group
<input type="checkbox"/> Breast					
<input type="checkbox"/> Cervix					
<input checked="" type="checkbox"/> Colon	EDRN WHI Colon Fred Hutchinson Cancer Research Center	Hanash, Samir	Colon	EDRN-WHI Pre-Clinical Colon Ca Specimens	Prostate and Urologic
<input type="checkbox"/> Esophagus					
<input type="checkbox"/> Lung	EDRN WHI Colon Harvard University	Hanash, Samir	Colon	EDRN-WHI Pre-Clinical Colon Ca Specimens	Prostate and Urologic
<input type="checkbox"/> Ovary					
<input type="checkbox"/> Pancreas	EDRN WHI Colon Johns Hopkins Medical Institution	Hanash, Samir	Colon	EDRN-WHI Pre-Clinical Colon Ca Specimens	Prostate and Urologic
<input type="checkbox"/> Prostate	EDRN WHI Colon Karmanos Cancer Institute	Hanash, Samir	Colon	EDRN-WHI Pre-Clinical Colon Ca Specimens	Prostate and Urologic
	EDRN WHI Colon Northeastern University	Hanash, Samir	Colon	EDRN-WHI Pre-Clinical Colon Ca Specimens	Prostate and Urologic
	EDRN WHI Colon Pacific National Northwest Laboratory	Hanash, Samir	Colon	EDRN-WHI Pre-Clinical Colon Ca Specimens	Prostate and Urologic

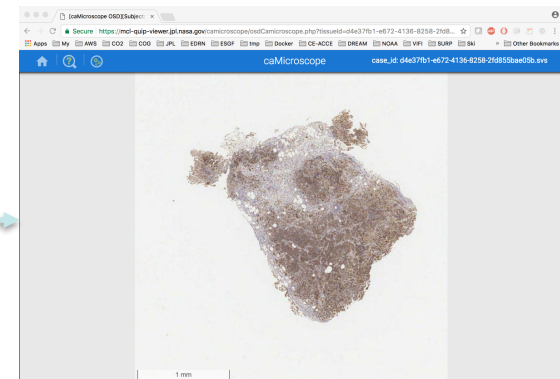
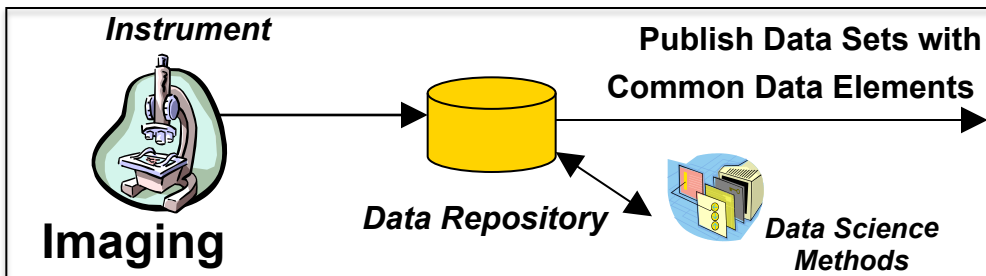
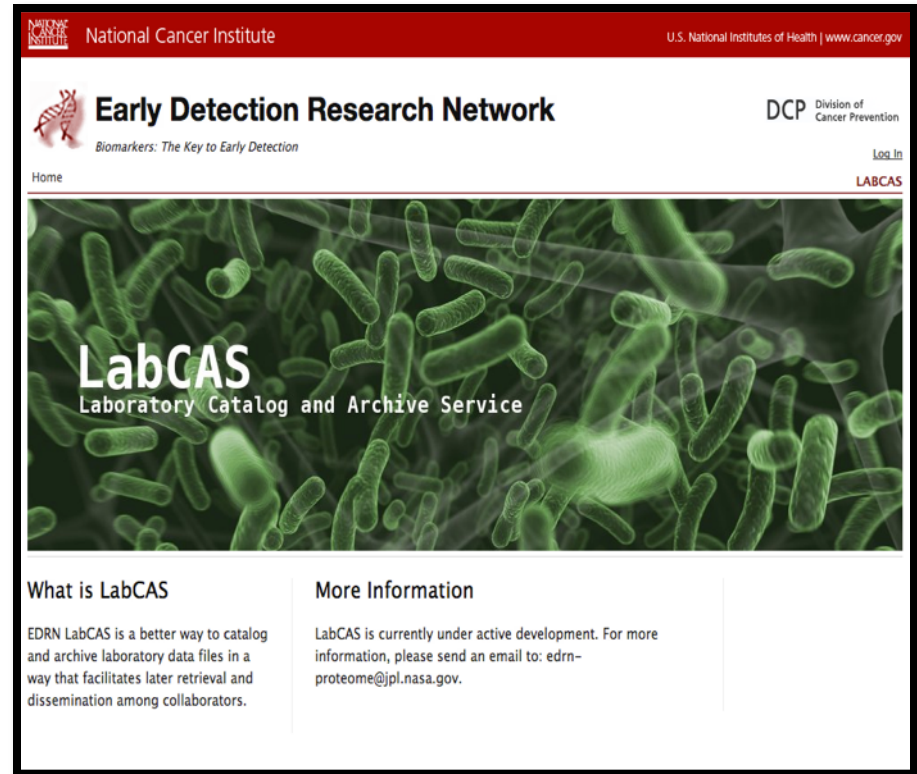
Data is linked and available for integration of different analytical methods and tools to drive data-driven discovery.

Addition of data sets over time – any data type generated

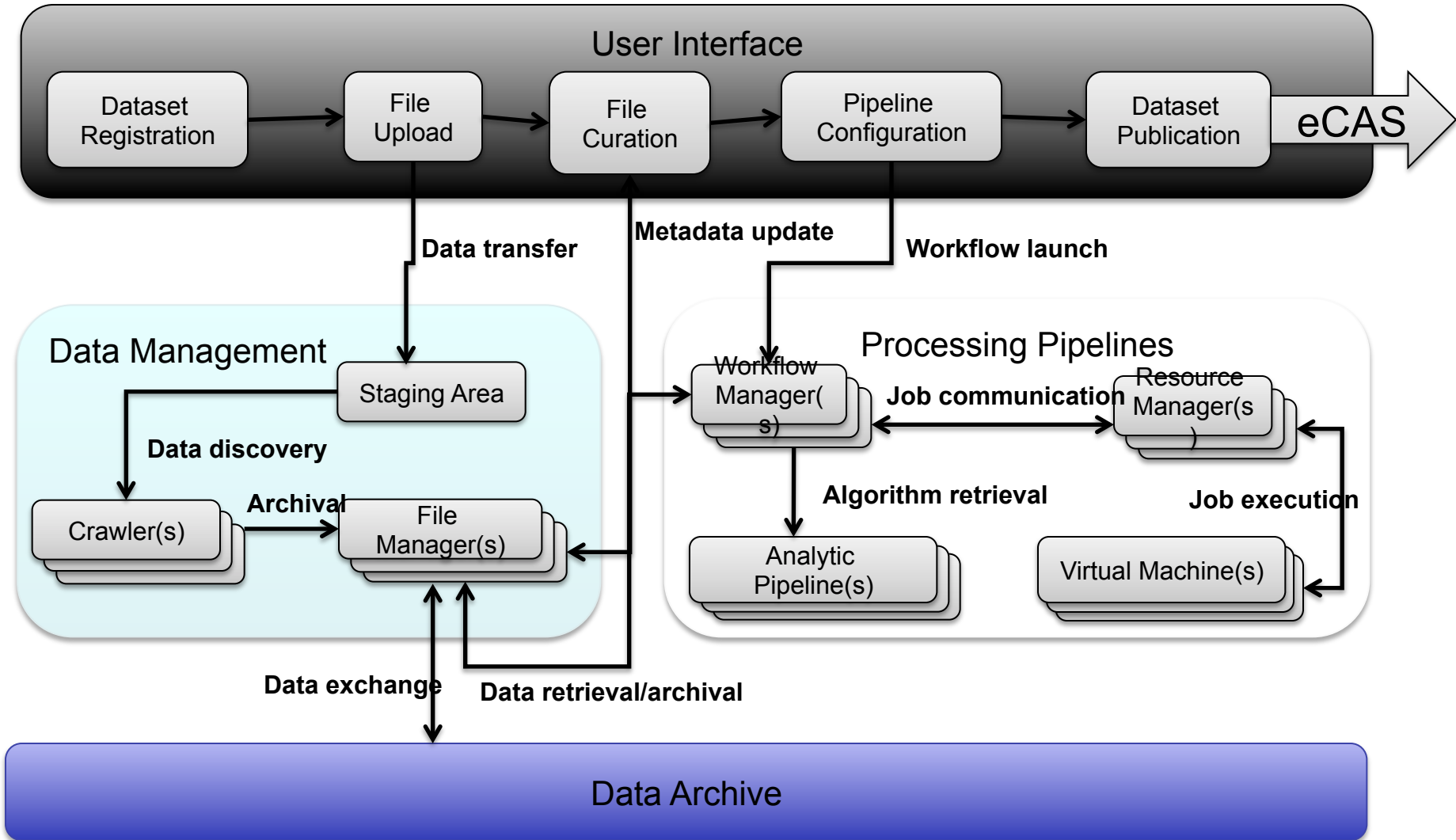
Drives a consistent data architecture across the consortium.

LabCAS: Capturing and Sharing Science Data Analysis Data and Pipelines

- A secure, reliable means to capture, process and manage data
- Plug in analytical methods
 - Repeatable data processing pipelines
- Integrate visualization

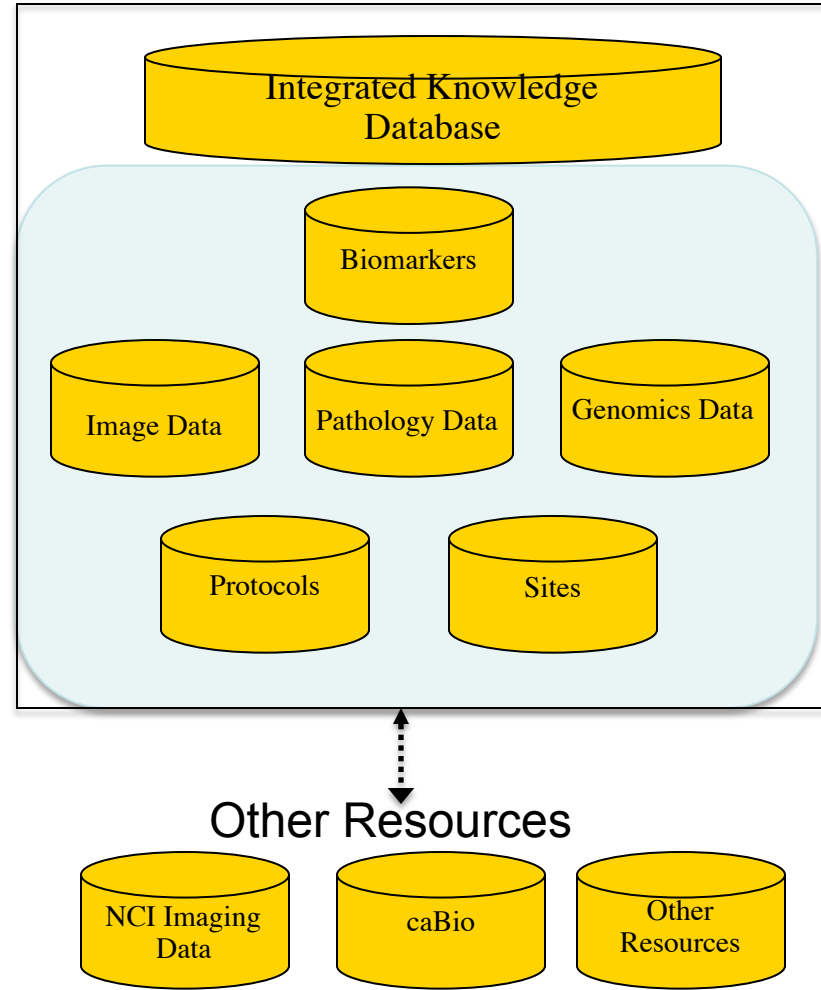
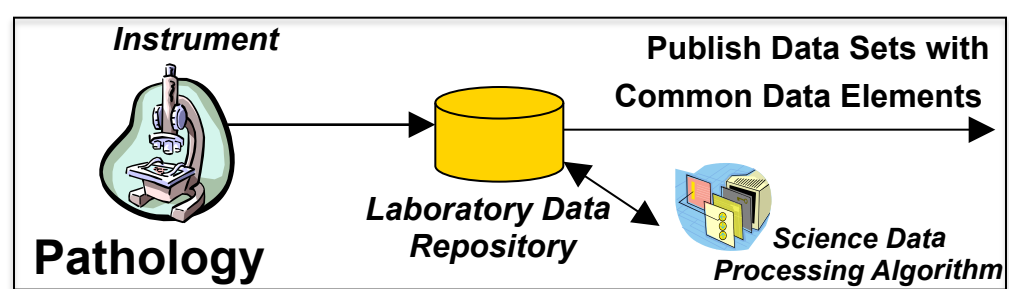
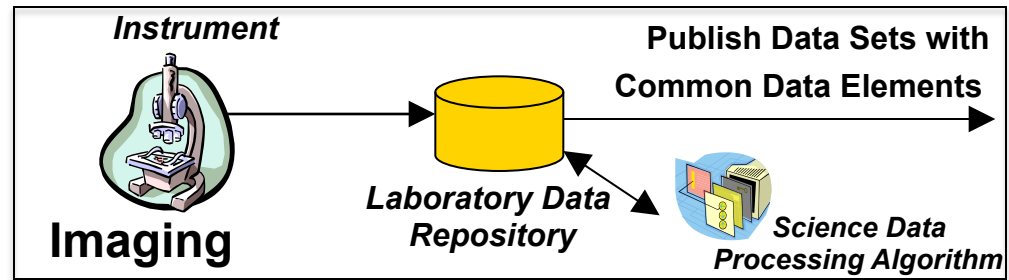
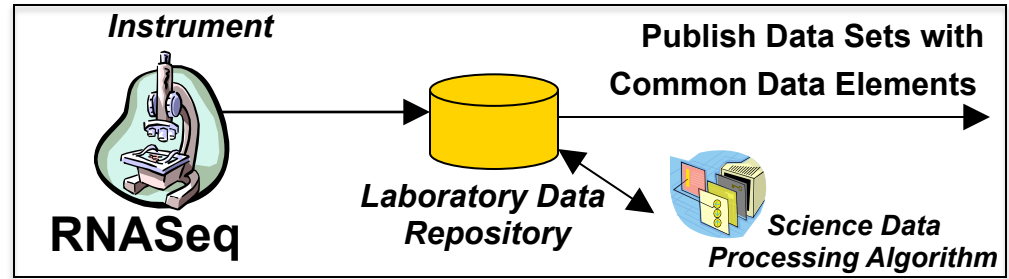


Data Capture, Processing and Ingestion



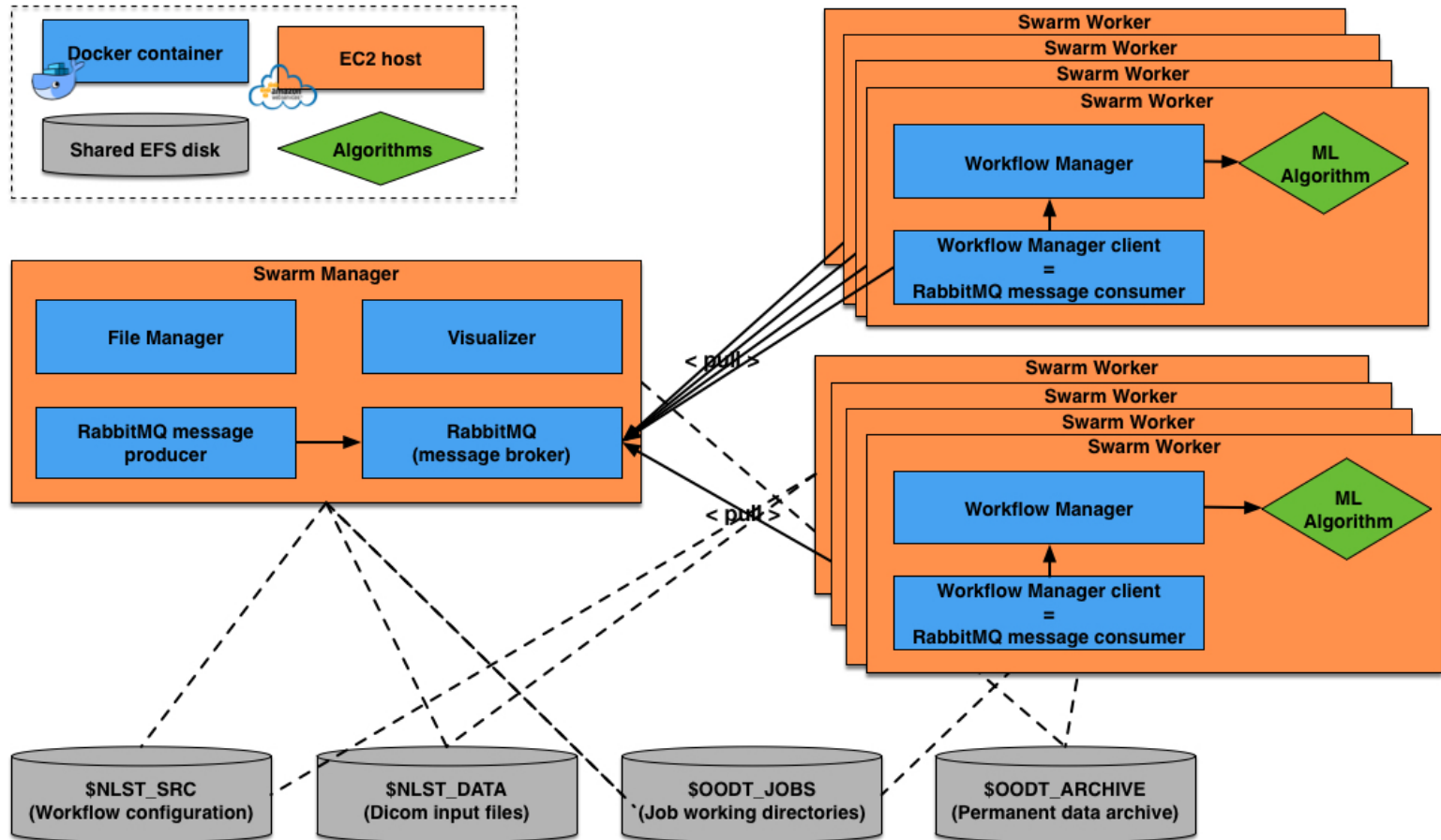
Data Pipelines and the Knowledge Environment

“LabCAS”

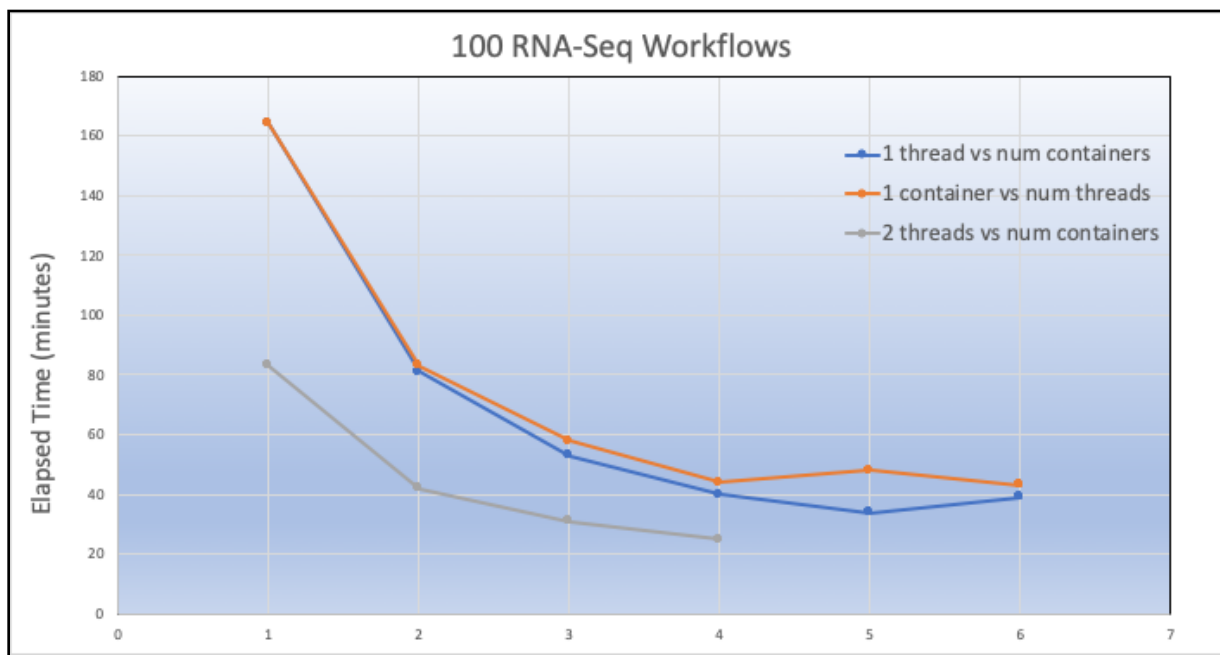


Scalable computing, common data elements, computational methods

- Uses Docker Swarm, Apache OODT workflows (from NASA/JPL), RabbitMQ messaging
- Can scale/auto-scale to any number of EC2 nodes



- Executing genomics workflow on single EC2 server (r5.2xlarge, 8 CPUs, 64 GB memory)
- Measuring time to execute 100 workflows vs # of containers, # of processes/container
- Can scale horizontally until processes start to compete for resources



- In collaboration with Dr. Chris Amos, Yafang Lee (Dartmouth)
- 10 TB of data for full study comparing gene expression profiles between smoking and non-smoking patients.
- Integrated Dartmouth analysis tools with 99% accuracy into LabCAS pipelines

NATIONAL CANCER INSTITUTE
 Consortium for Molecular and Cellular Characterization of Screen-Detected Lesions

LabCAS
 Logged in as Luca Cincini
[Logout](#)

[Collections / Dartmouth Lung Adenocarcinoma Gene Expressions](#)

Name:	Dartmouth Lung Adenocarcinoma Gene Expressions
Identifier:	Dartmouth_Lung_Adenocarcinoma_Gene_Expressions
QA State:	Private
Description:	RNA Sequencing Case Studies
Lead PI:	Chris Amos
Organs:	Lung

Other Metadata

CollaborativeGroup:	Lung and Aeroedigestive
Consortium:	MCL
DataCustodian:	Yafang Li
Discipline:	RNA Sequencing
Institution:	Dartmouth - Coordination and Data Management
ProtocolName:	Differential gene expression in lung adenocarcinoma
QAState:	Private

Datasets in this Collection

ERR164473
ERR164474
ERR164475
ERR164476
ERR164477
ERR164478
ERR164479
ERR164480

Dataset: ERR164473

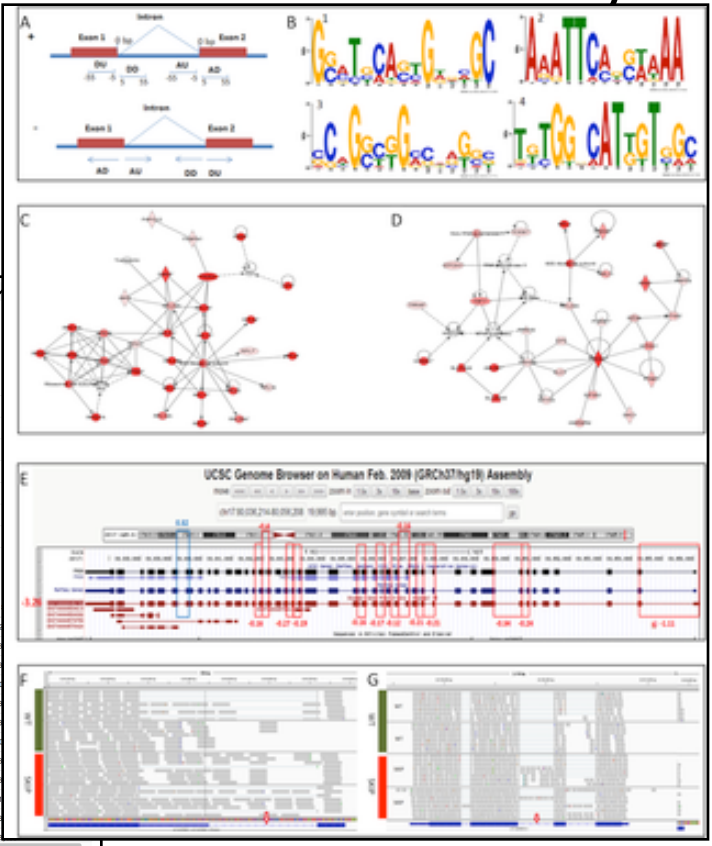
Identifier: Dartmouth_Lung_Adenocarcinoma_Gene_Expressions.ERR164473
 Name: ERR164473
 Description: ERR164473

Other Metadata

ExtractedMolecule:	polyA RNA
InstrumentModel:	Illumina HiSeq 2000
LibrarySelection:	cDNA
LibrarySource:	transcriptomic
LibraryStrategy:	RNA-Seq
SampleType:	SRA
SourceName:	Lung cancer cells
Species:	Homo sapiens

Files

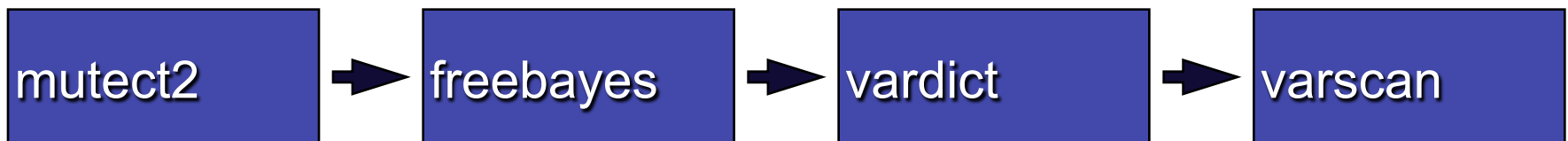
Name	Type	Description	Thumbnail
ERR164473.sra	Binary Data		3.5
ERR164473.sra.met	Binary Data		278.6
ERR164473_1.fastq	FASTQ Nucleotide Sequence		800.0
ERR164473_1.fastq.met	Binary Data		278.6
ERR164473_1.fastq.met.met	Binary Data		350.0
ERR164473_2.fastq	FASTQ Nucleotide Sequence		800.0
ERR164473_2.fastq.met	Binary Data		278.6
ERR164473_2.fastq.met.met	Binary Data		350.0
gene.counts	Binary Data		1.0
gene.counts.met	Binary Data		278.6
gene.counts.met.met	Binary Data		350.0



- In collaboration with Robert West, Joseph Foley, Sujen Vennam @ Stanford School of Medicine
- Smart-3SEQ: new method for quantifying gene expressions in small RNA samples including single cells (see: <https://github.com/jwfoley/3SEQtools>)
- Smart-3SEQ pipeline is composed of 3 steps:
 - FastQ generation and alteration (w/ Illumina bcl2fastq)
 - Gene alignment (w/ Samtools, STAR, UMI-dedup)
 - Read counting (w/ Bioconductors)



- In collaboration with Olivier Harismendy at UCSD
 - See <https://github.com/bcbio>, <http://bcbio.io>
- Using bcbio (“Bue Collar Bioinformatics”): Python framework and community tools for analysis of biological data (variant calling, RNA-SEQ and small RNA pipelines)
- Experimented with running sample pipelines (big and small)



Multi-dimensional Integrated Data

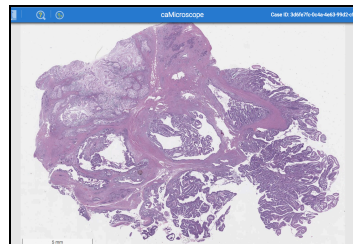
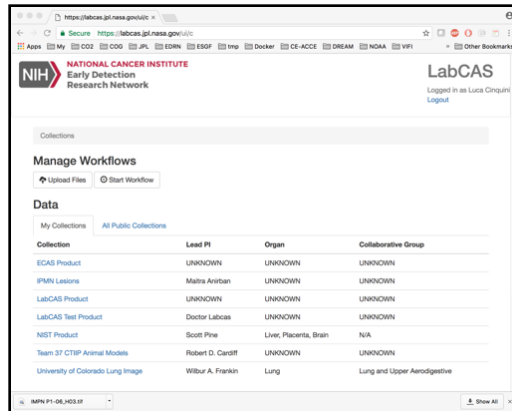
Collaboration with Sandy Borowsky/UC Davis and Anirban Maitra/MD Anderson

- Developed a pathology archive for MCL

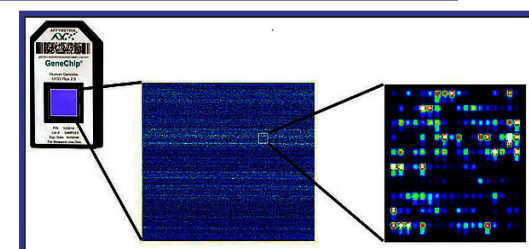
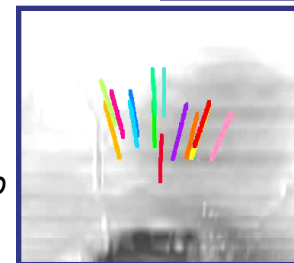
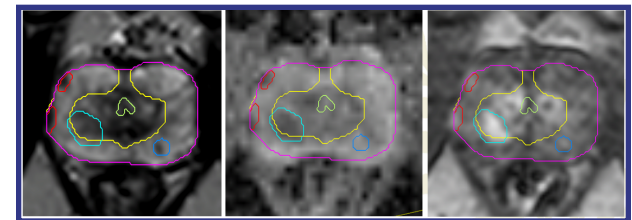
- Dr. Maitra goal: multi-dimensional data – IPMN ppts

Collaboration with Radka Stoyanova and Alan Pollack

- MAST (Mapped Active Surveillance Trial). Longitudinal multivariate data (mpMRI, pathology and gene expression) is obtained from patients on Active Surveillance for prostate cancer.



*Path Viz Tool Credit:
caMicroscope - Dr. Joel Saltz Lab
ITCR Program*



Collections / MD Anderson Pancreas IPMN images / IPMN P1-06_H03

IPMN P1-06_H03

Identifier: MD_Anderson_Pancreas_IPMN_imag
Name: IPMN P1-06_H03

Other Metadata

Diagnosis

Gender

Species

Files

- Name
- IPMN P1-06_H03.tif
- IPMN P1-06_H03_[50545,12210].im3
- IPMN P1-06_H03_[50545,12210]_component_data.tif
- IPMN P1-06_H03_[50545,12210]_image_with_a...seg.tif
- IPMN P1-06_H03_[50545,12210]_image_with_cell_seg_m...

Collections / MD Anderson Pancreas IPMN images / IPMN P1-06_H03 / IPMN P1-06_H03_[50545,12210]_image_with_tissue_seg.tif

IPMN P1-06_H03_[50545,12210]_image_with_tissue_seg.tif

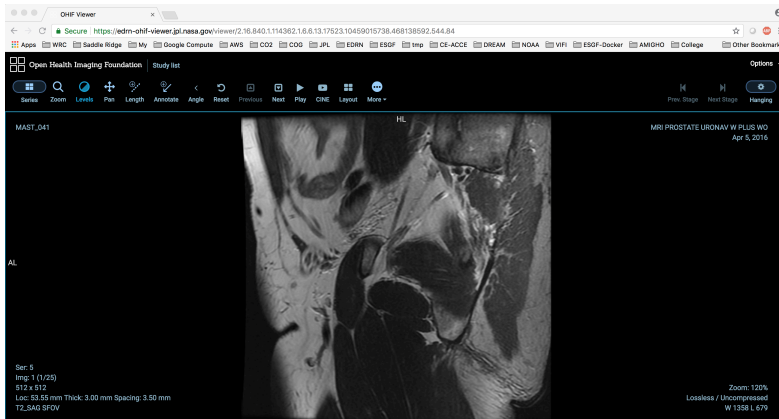
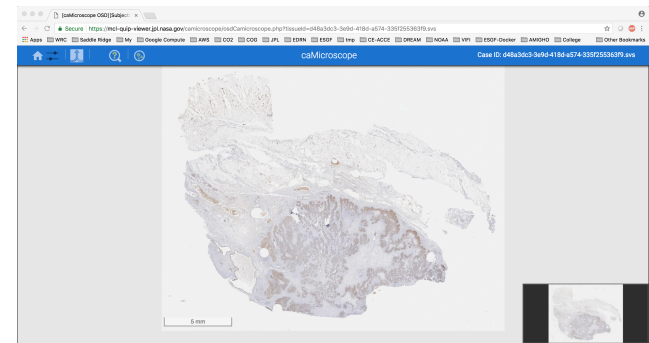
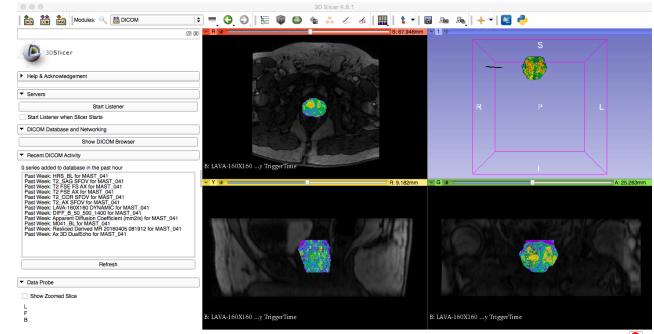
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Size: 2.2 MB
Content type: image/tiff

[Download this file](#)

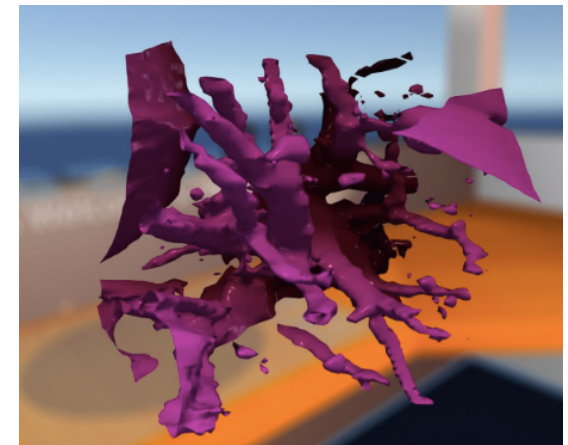
Other Metadata

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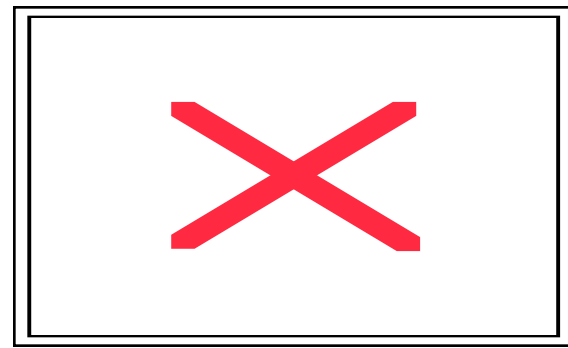
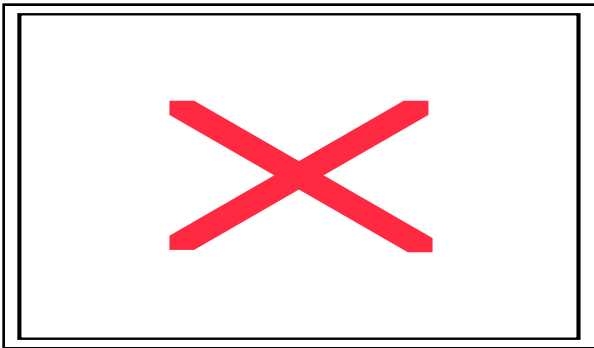
- Framework to plug-in many open-source viewers (client and server side)
 - caMicroscope
 - OHIF DICOM Viewer
 - 3D Slicer
- Capture additional metadata
- User specified organization of data
- Explore VR and other approaches for multi-dimensional imaging



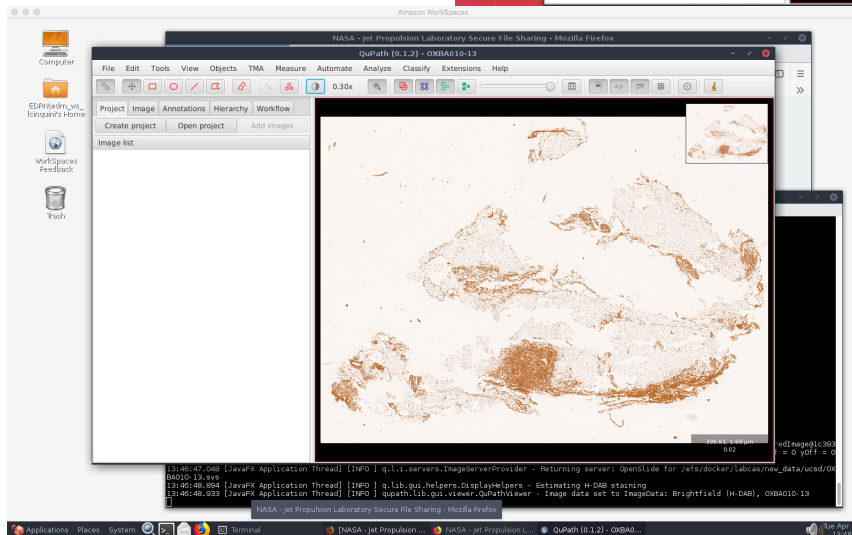
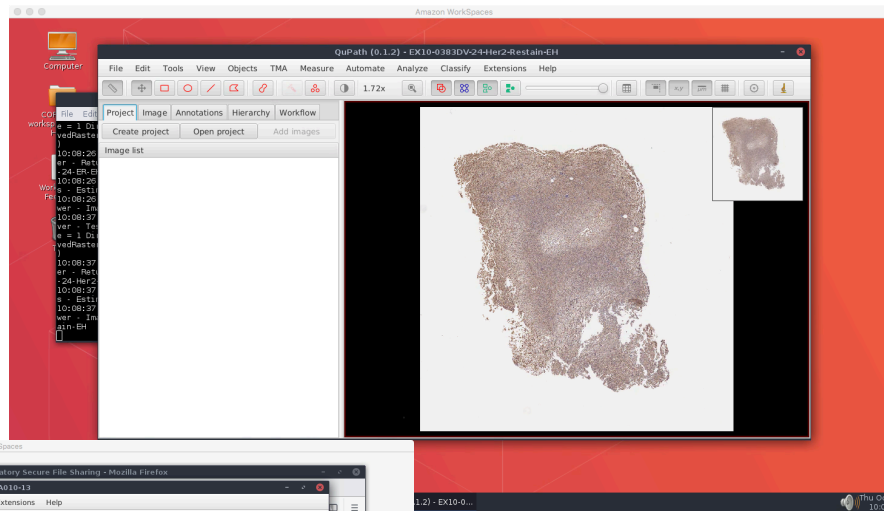
3D rendered isosurfaces: section of lung tissue



- Remote desktops running on the AWS Cloud
- Support analysis tools that must be installed on client machines, to access local data:
 - QuPath for use by Sandy Borowsky's group (UC Davis)
 - 3D Slicer for use by Radka Stoyanova's group (Univ. Of Miami)

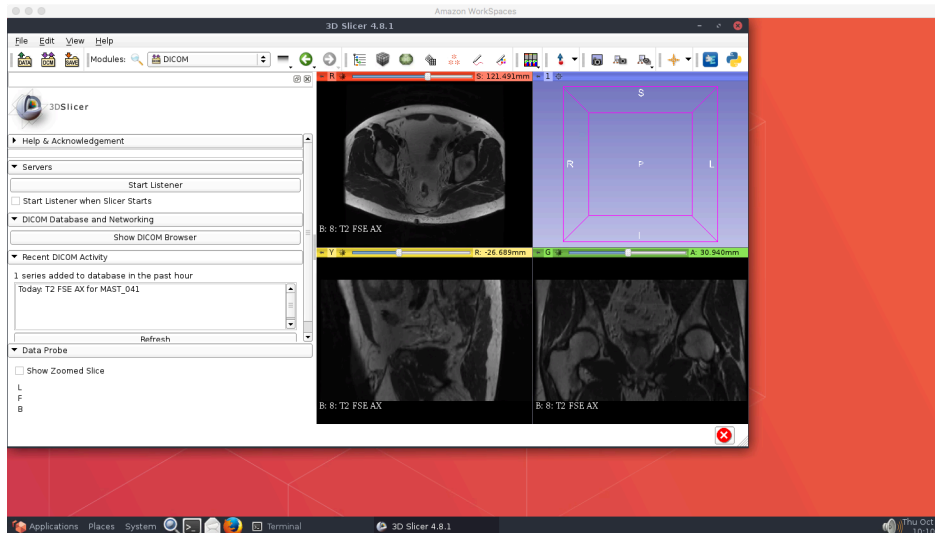
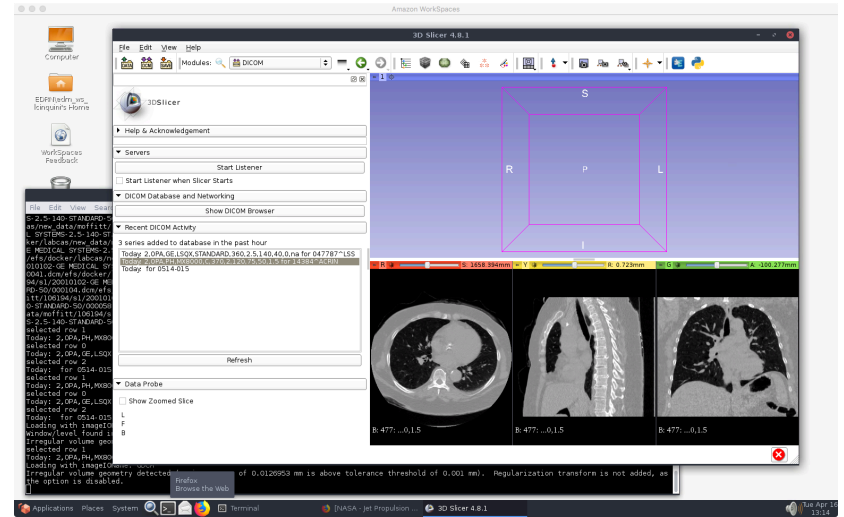


UC Davis Pathology data



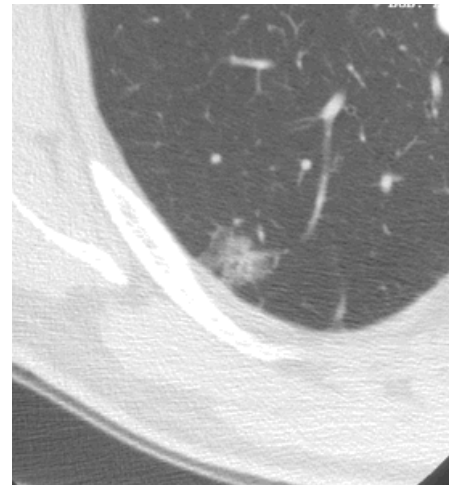
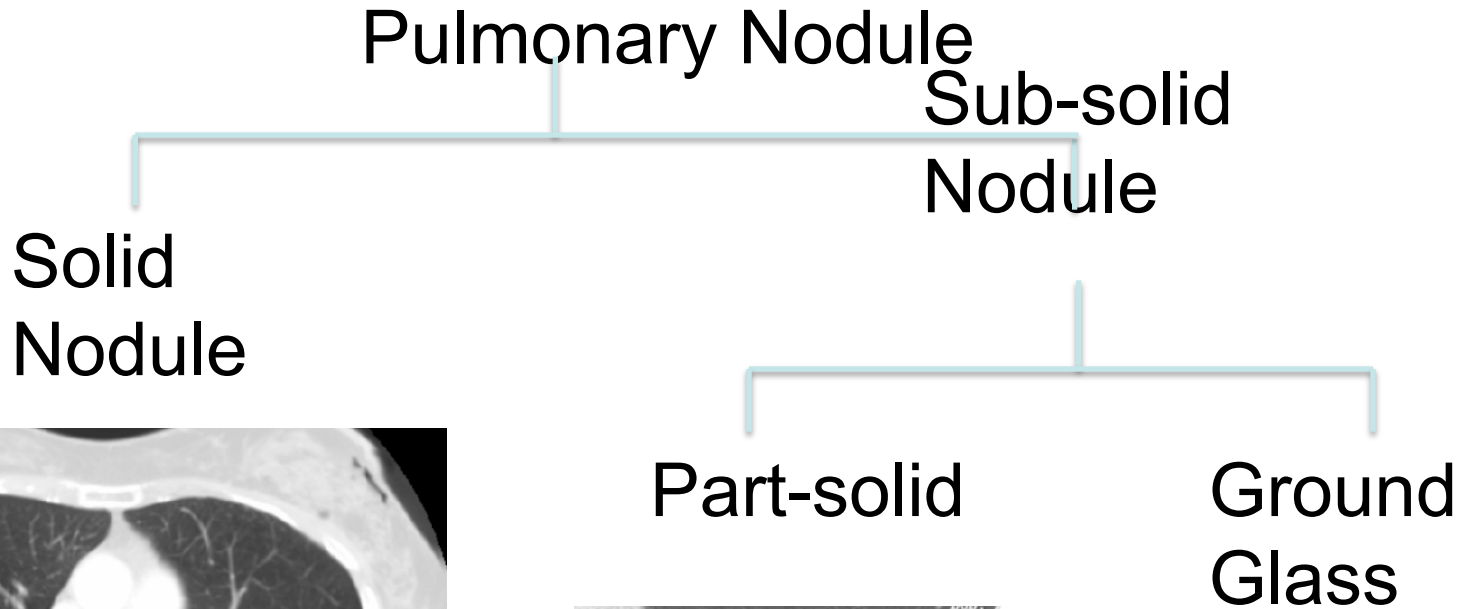
UCSD DNA-Sequencing data

Moffitt lung data



Univ. of Miami prostate data

Feature classification in images



Crowd Sourcing Image Analysis

Lung cancer

ABOUT CLASSIFY TALK COLLECT



Choose type of nodule

- Solid
- Semi-solid
- Ground Glass
- No nodule
- Skip/Unclear

Need some help with this task?

Back

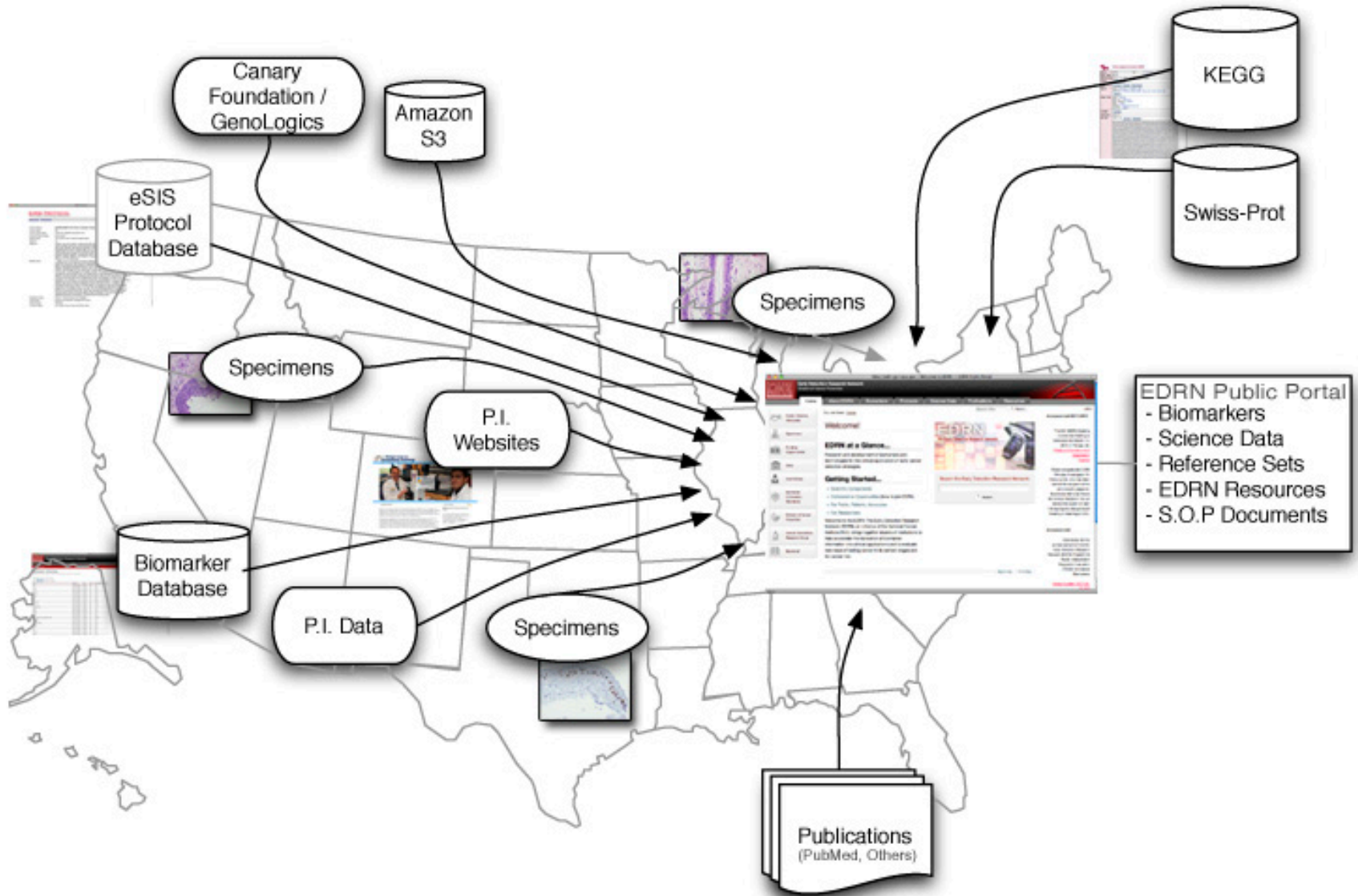
Done



Show the project tutorial

Adaptation of Zoonverse
Reduce False Positives from
traditional ML
Enable radiologists seed
unsupervised clusters
Drive towards ML pipelines

What's Emerged: A Virtual, National Integration Biomarkers Knowledge System



What's in Place Today

- A national, biomarker knowledge system serving multiple programs
- A biomarker data infrastructure consisting of ~1000 biomarkers, ~200 protocols, 1500 publications, 100 TB data
- Tools for laboratories to support the processing, capture, curation and sharing of data before publications
- Pilot projects in imaging, scalable workflows, data integration, etc
- Support for data-driven approaches for data discovery and analysis
- Common portals to access the knowledge environment

NIH Data Science Strategic Plan*

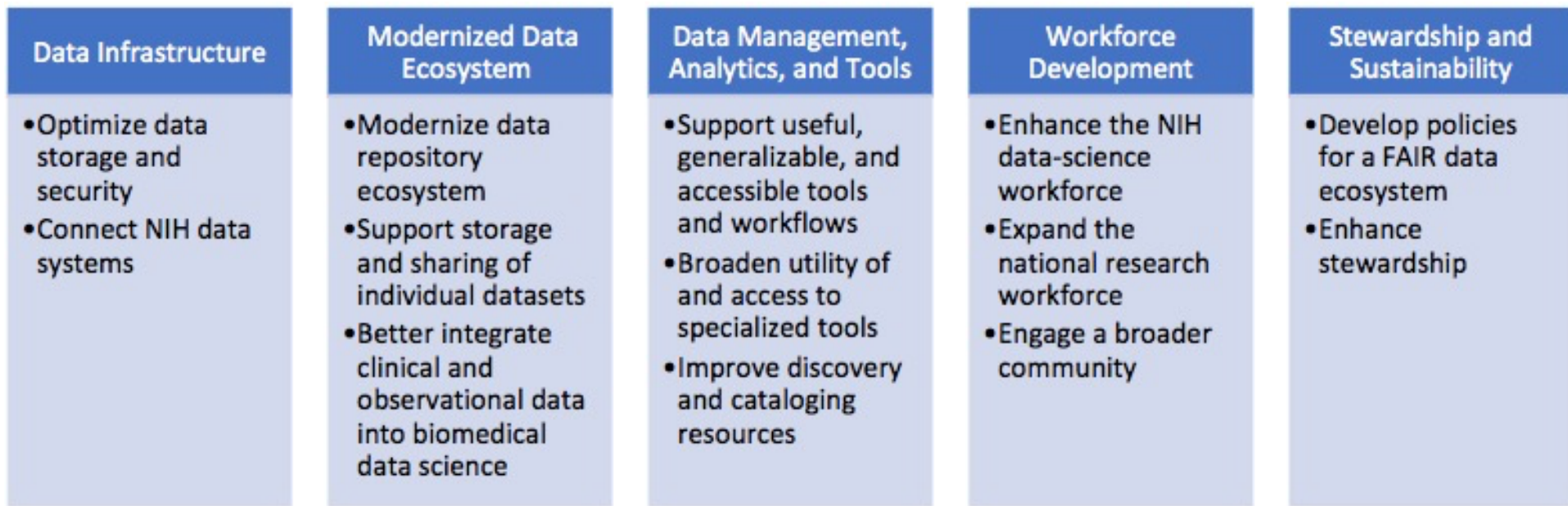
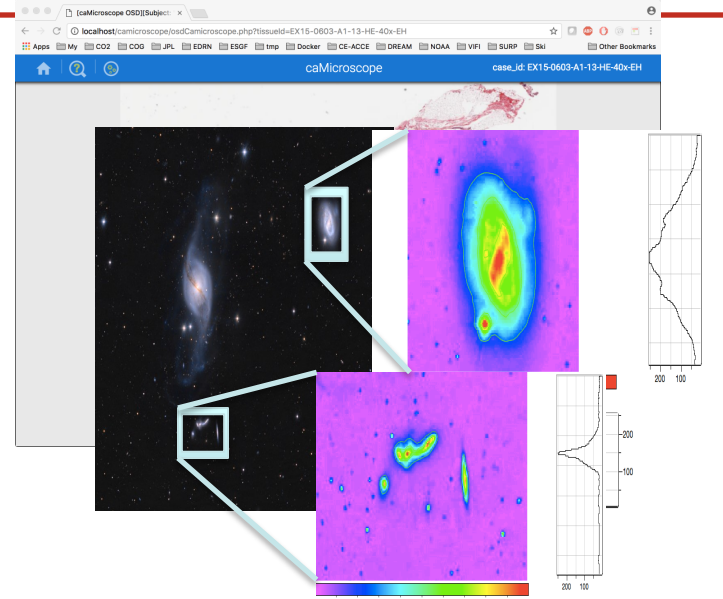


Figure 2. NIH Strategic Plan for Data Science: Overview of Goals and Objectives

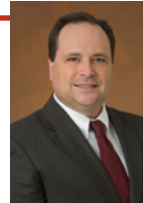
* By 2025, the total amount of genomics data alone is expected to equal or exceed totals from the three other major producers of large amounts of data: astronomy, YouTube, and Twitter.

Future Directions

- Systematize the capture of data end-to-end into a knowledge environment
- Integrate data-driven techniques and tools such as machine learning as part of the end-to-end knowledge environment
- Enable collaborative analysis that scales
- Unify consortium enterprises and data
- Enable science through an explicit and well architected data science strategy and platform



JPL Informatics Center Data Science Team



Dan Crichton
NASA/JPL

Principal Investigator

Data Architecture



- Luca Cinquini NASA/JPL
- Asitang Mishra NASA/JPL

Portal
System Engineering



Sean Kelly
NASA/JPL



David Liu
NASA/JPL

Project Management
Data Coordination



Heather Kincaid
NASA/JPL

Machine Learning
Visualization



Ashish Mahabal
Caltech

- Alphan Altinok
NASA JPL
- Santiago Lombeyda
Caltech

Bioinformatics
Biomarker
Curation/CDEs

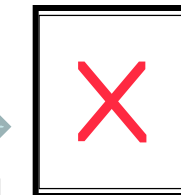


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NASA/JPL

- Susan Neely NAS
JPL
- Rojeh Yaghoobi
NASA/JPL

Backup
