

# NEON Data Delivery & Cyberinfrastructure



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(mission, data products, data delivery, processing, architecture, interoperability, improvement plans)





#### Why is NEON important?

NEON provides a coordinated national system for monitoring a number of critical ecological and environmental properties at multiple spatial and temporal scales.

...transformative science

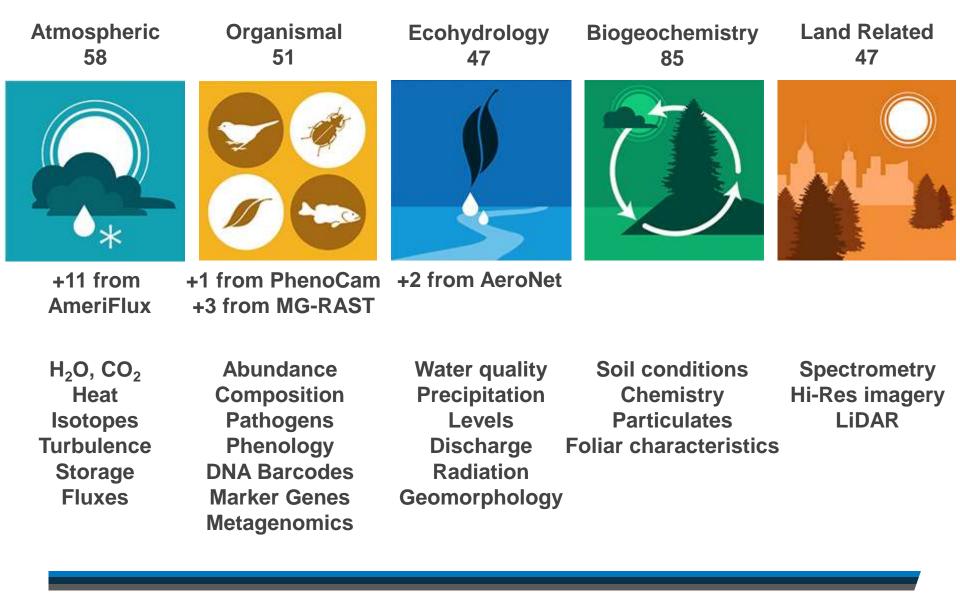
...workforce development







## **NEON's 176 Data Products Overlap Multiple Themes**



This material is based upon work supported by NSF's National Ecological Observatory Network, a major facility fully funded by the National Science Foundation.

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#### **NEON CI & Data Science Offerings**

National **Cyberinfrastructure** = resources, tools & services, observation to delivery **E**cological **O**bservatory Network - of field observational results Data - of sampling protocols - of algorithms surface atmospheric exchange/fluxes Process meteorological temporal interpolations - of data science methods APIs @ PhenoCam, MG-RAST, BOLD People Ecological semantic conventions e.g. EML Dictionary-driven generic observational pipeline Data integration via workflow models - of practitioners 21 Working Groups; ~1,500 unique users & 75k API hits/month Carpentry workshops & interns Digital identifiers for data use/provenance Large data facilities coalitions, e.g. RDA, CDF, ESIP

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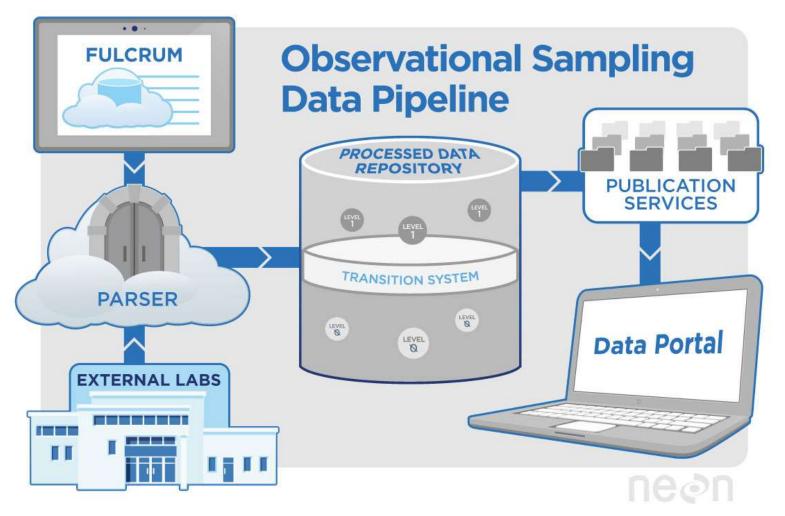


## **NEON CI Data Delivery**

Data Product Type	General Latency from Sampling to Portal	Primary Influence on General Latency	Existing Backlog	Estimated Complete Publication of Backlog
AOP	2 months	Staff during flights	2018 ongoing	Nov2018
AOP legacy		Reprocessing with new algorithms	2013-2016	Dec2018
Land, Water, Soil, Meteorology	15 <sup>th</sup> of next month	5 day communications completion buffer	2018 ongoing	Monthly
Land, Water, Soil, Meteorology legacy		Volume of prior site-months	2013-2017	Nov2018
Eddy Covariance	15 <sup>th</sup> of next month	5 day communications completion buffer	2018 ongoing	Monthly
Eddy Covariance legacy		Volume of prior site-months & configurations	2013-2017	Nov2018
OS – field observations	1-4 months (~9-13 for fish & veg structure)	Reviews as season progresses. HQ staff.		Oct2018
OS – domain lab results	1-3 months (6 & 13 for morphospp. & bathy)	Reviews as season progresses. HQ staff.		Sep2018
OS – external lab rolling batches	1-9 months	Reviews as season progresses. Lab deliveries.		Dec2018
OS – one time samples (megapits, soil)		external lab processing - MBL		Dec2018



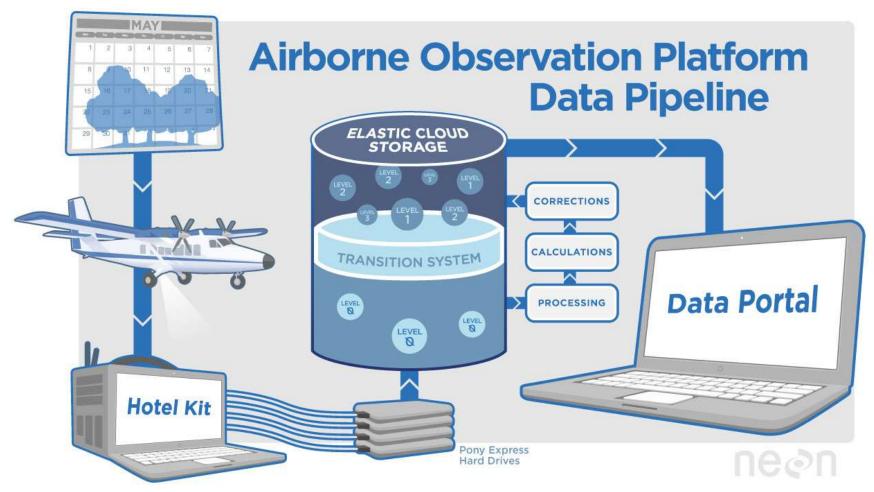




- 47 terrestrial & 34 aquatic sites, 100s protocols, dozens of labs
- Latencies from 5 to 365+ days

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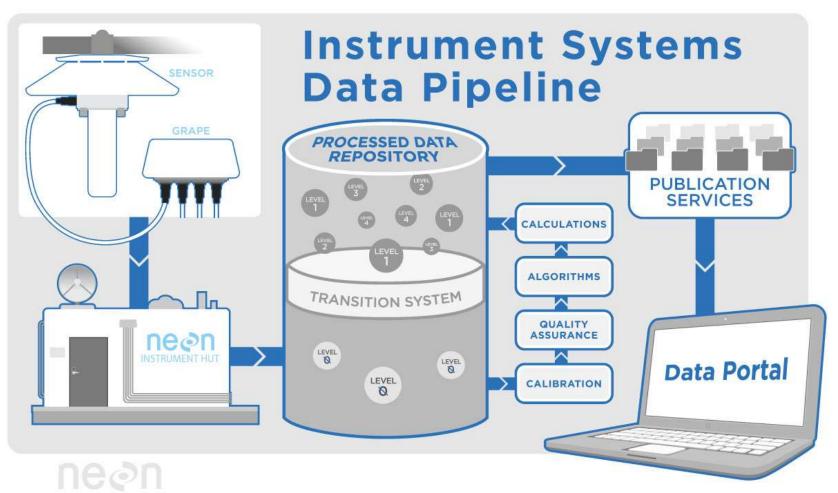
- 19 domains, 100-300km<sup>2</sup> flown annually at peak greenness
- Images, Spectroscopy (380 to 2500 nm), LiDAR
- 1-500GB/data product, ~2PB/yr

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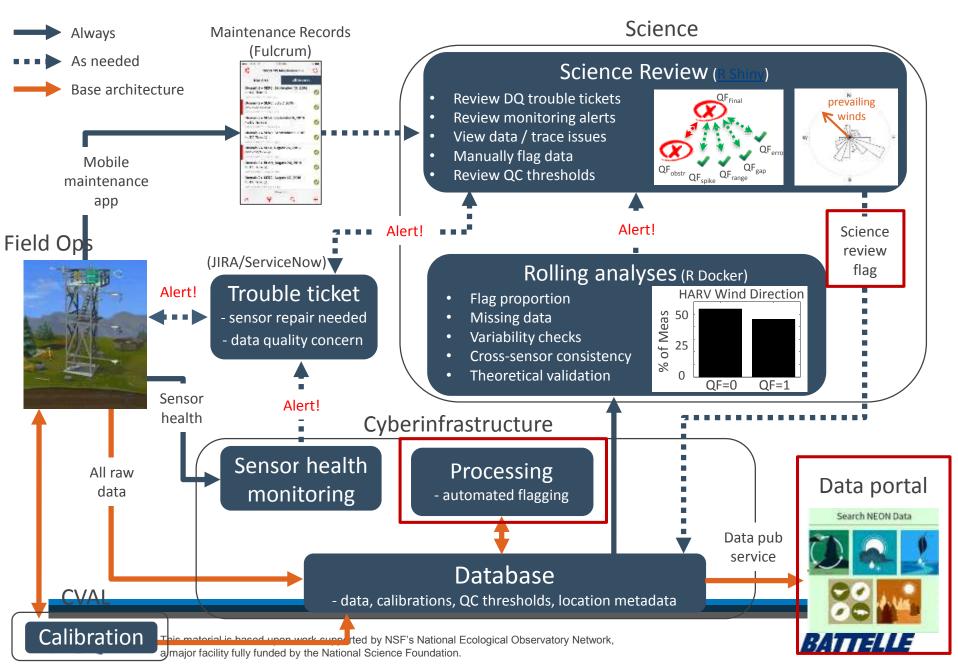


- 81 sites, 100s sensors per site, up to 40Hz
- Sensor→GRAPE→LC→HQ 5day lag, ~5TB/month



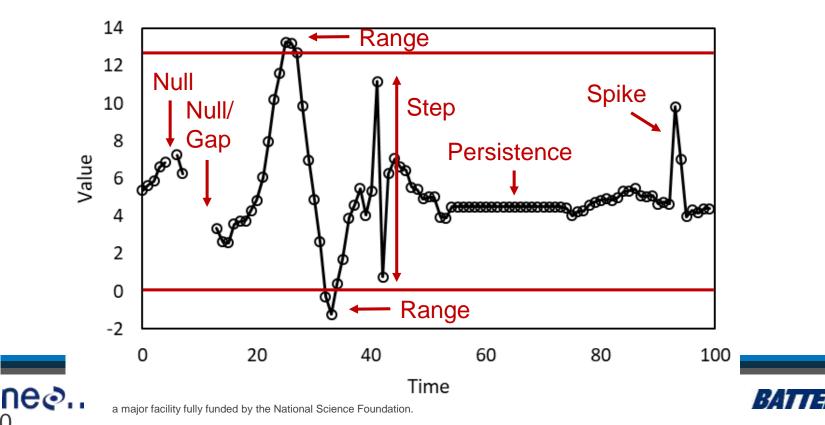


#### **Instrumented Systems Data QA/QC Framework**



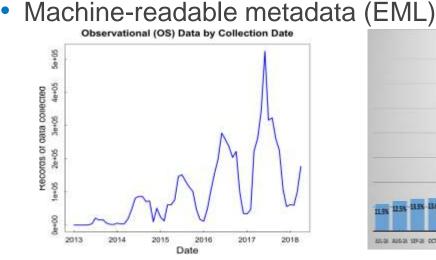
#### **Automated flagging**

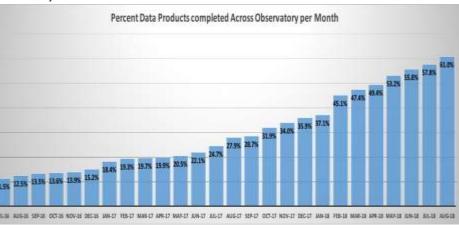
- Applied on each calibrated data value (native resolution)
- Basic tests: Null, Gap, Range, Step, Spike, Persistence
- Sensor-specific tests: e.g. sensor diagnostic
- If chosen, can remove any data point that fails a test



# What's in a data package?

- Monthly or Annual data files with all basic data and quality flags
- CSV (IS, OS), HDF5 (EC, AOP), TIF (AOP), LAS (AOP), FASTA (metagenomics)
- Readme text file general info about the data product
- Additional quality metrics, external lab data
- User guides & protocols; algorithm & sensor configuration documents
- Variable definitions, validation rules, and sensor positions

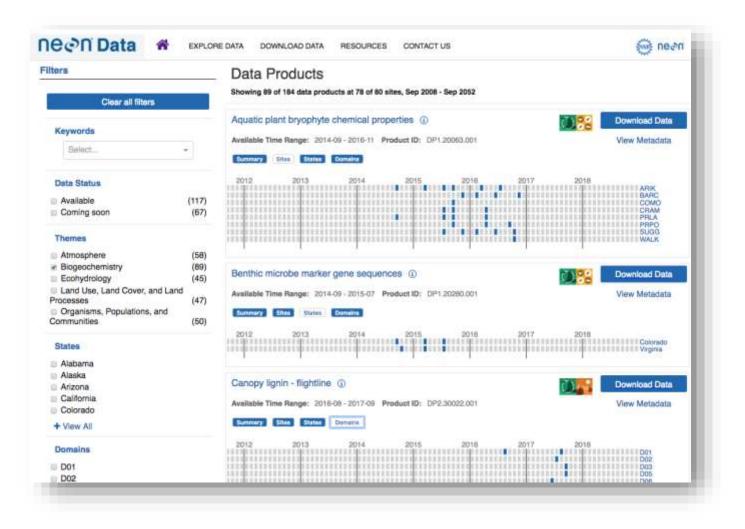








# **Interactive Browse**







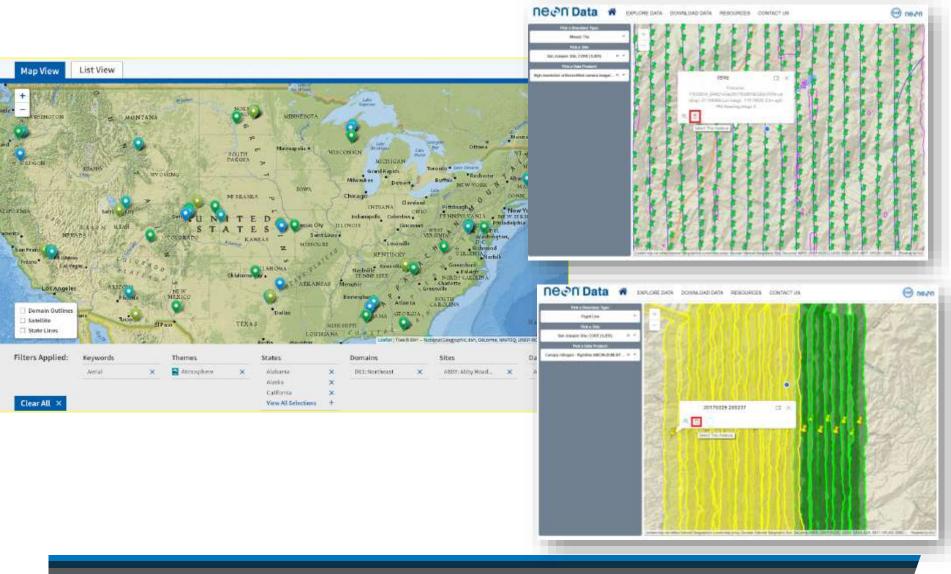
# **Interactive Time Series**

CONTRACTOR OF A	thetically active radiation at water surface		
Site:	ARIK (Arikaree River)  w Month: 2017-11  w		
Positions:	× (horizontal: 101, vertical: 100)		
Variables:	Select Variables		
Log Scale		1	
starDateTime: 2011 PARMean: 241.8 PARMinimum: 11 PARMaximum: 4 PARMaximum: 4 PARMariance: PARNumPts: 18( PARExpUncet: PARStdEr/Mean:	<sup>32</sup> 78.4 2000 23.39 <b>: 4340.28</b> 400		





# **Spatial Viewer (prototypes)**



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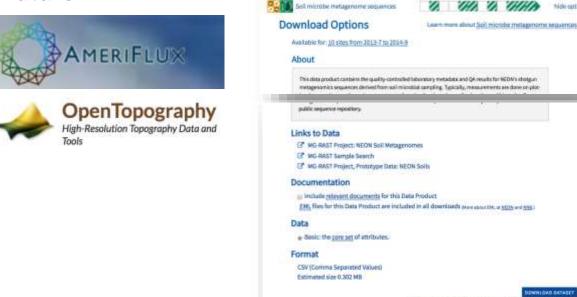
# **Partner Repositories**

- Work with specialized repositories for domain-specific data
- Use their APIs to keep NEON caches in sync
- Field data on portal; specialized data hosted

Current



#### Future



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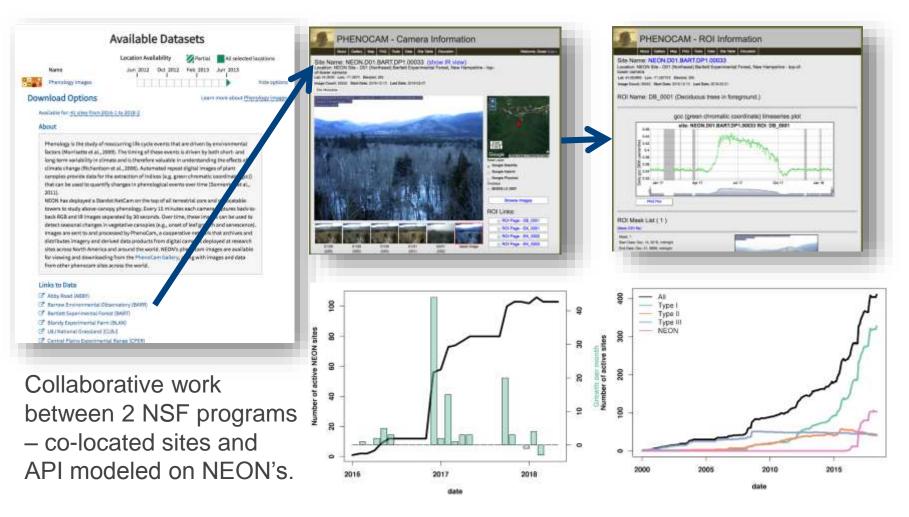
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Location Availability

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# **Data Portal & Phenocam Gallery**

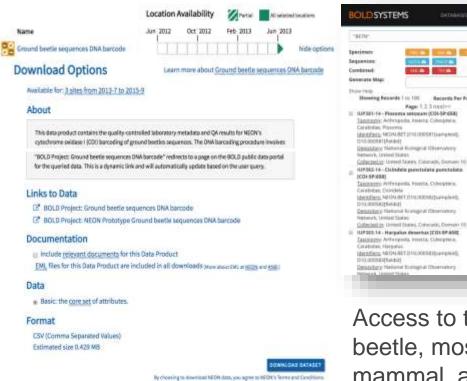


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# **Data Portal & BOLD**



#### **MG-RAST** is similar in functionality

Access to thousands of beetle, mosquito, small mammal, and fish records, from current protocols as well as prototype protocols and sites.

Patrix Data

**Results Summary** 

Found (1) published records

Specimen Distribution

Forming IN BMs (Clutters). with spectrums from 1 courses

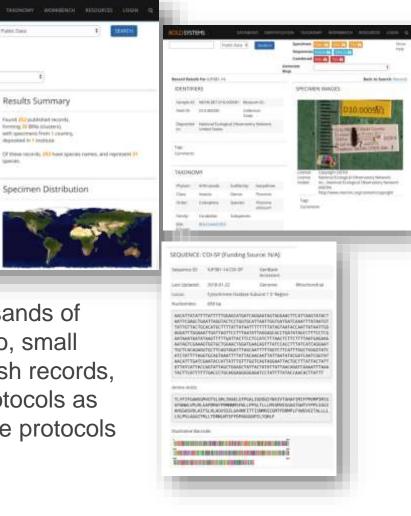
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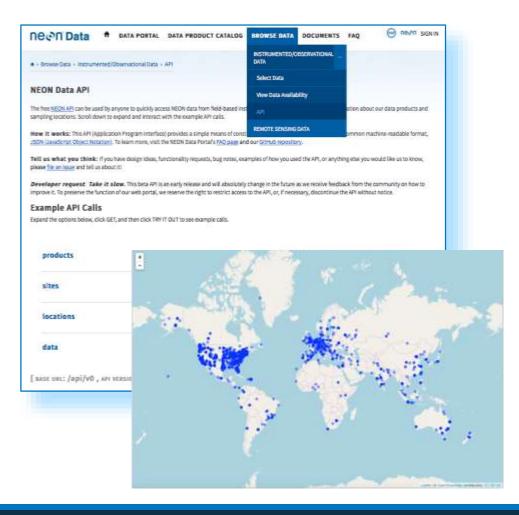
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# **REST API: Programmatic Access**

#### http://data.neonscience.org/data-api

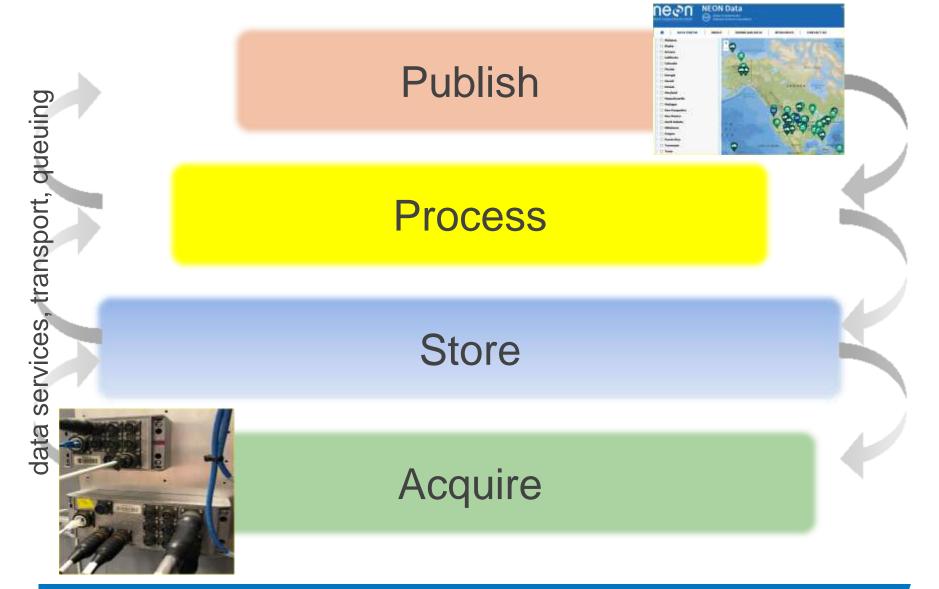
- Open access
- Provides product information, site and within-site information, documents, and data
- Returns information in JSON format
- Returns both zipped data packages and individual data files
- Recently added endpoints for access to taxonomic lists and sample custody histories







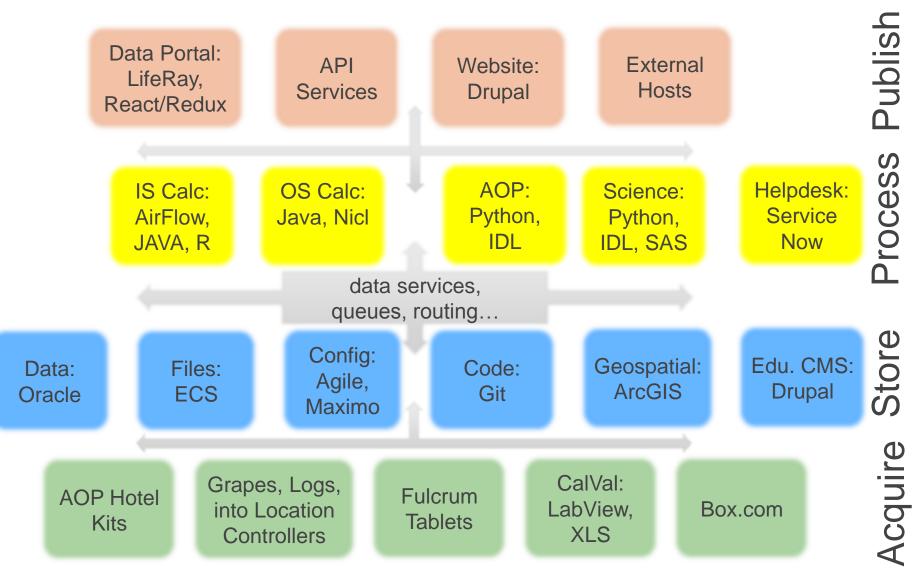
#### **NEON CI Software Architecture - Layers**



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## **NEON CI Software Architecture - Elements**



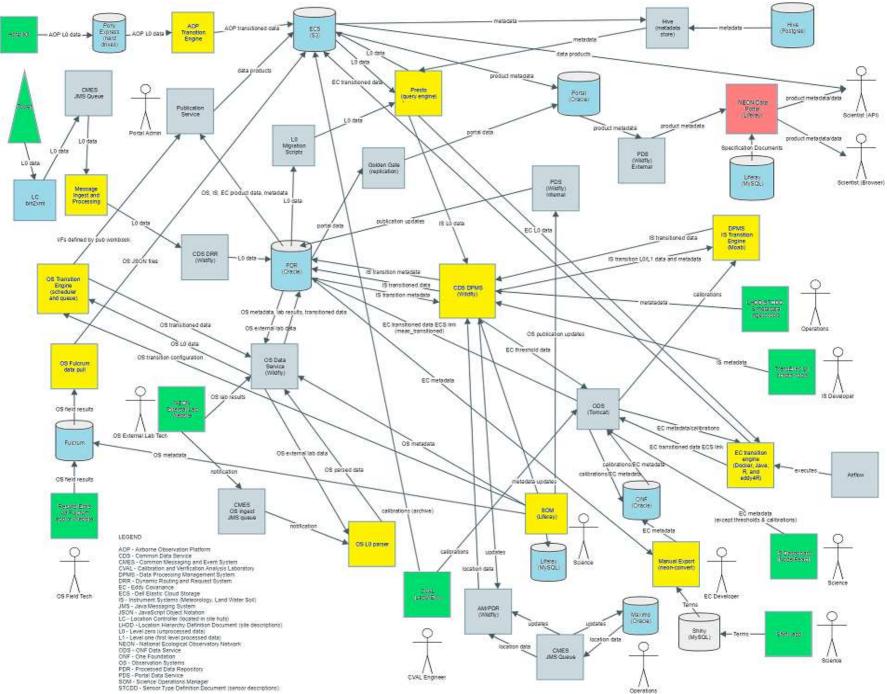
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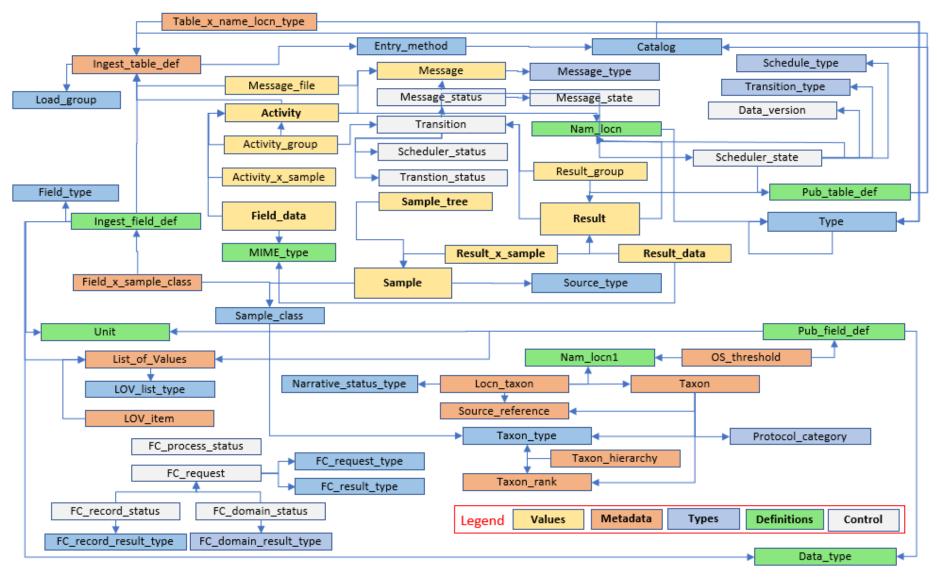
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#### **NEON Data Flow in CI Architecture**



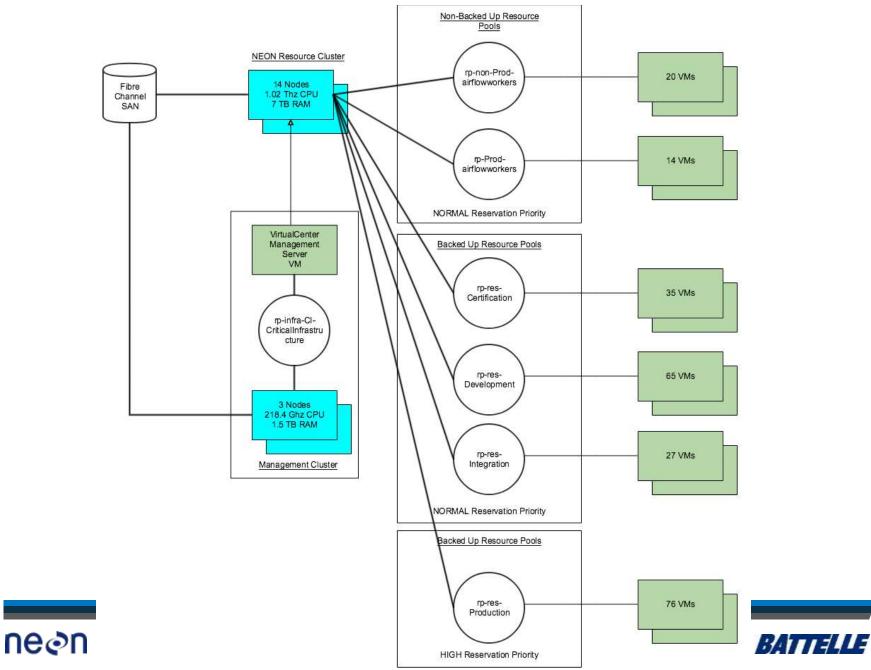
#### **PDR Database – Observations Logical Model**



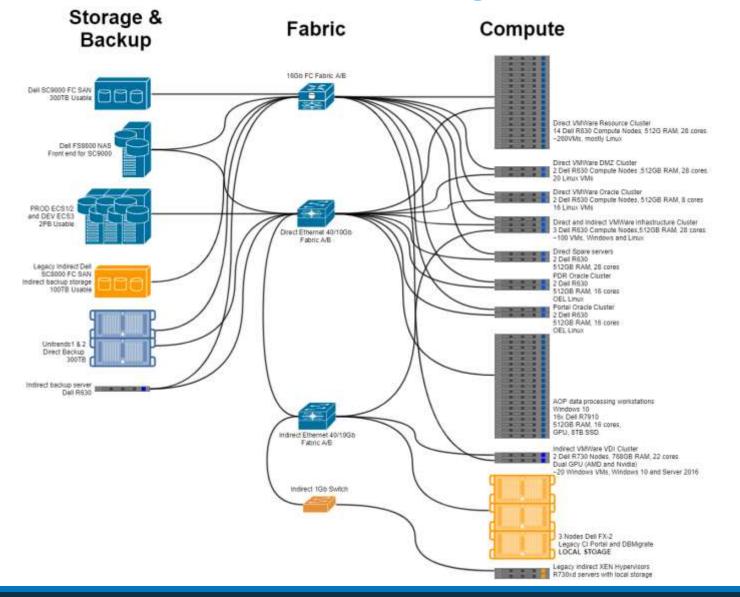




#### **NEON CI Virtual Machine Resource Pools**



#### **Denver Datacenter – Configuration Schema**



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## **Cyber Security Overview**

- 1. Security Strategy NIST Cyber Security Framework: Identify, Protect, Detect, Respond, Recover
- 2. NIST CSF Timeframe Program in progress Goal is to address all categories by mid 2019
- 3. Perimeter Security All Ingress / Egress Points are Firewall protected
- 4. Cloud Security Encrypted Connections (TLS 1.0+) to Cloud Apps
- 5. Endpoint Security Anti-malware / Endpoint Controls
- 6. Vulnerability Remediation Constant patching schedule
- 7. Email Security Microsoft Advanced Threat Protection Phishing, Malware, Safelink protection
- 8. User Awareness All employees are required to complete annual cyber security training





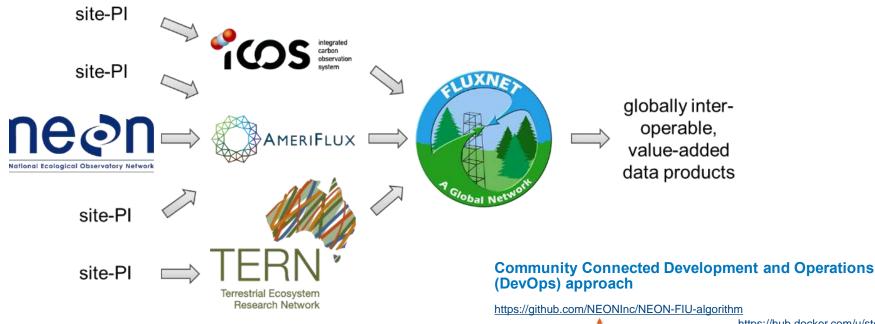
#### **NEON CI & Data Interoperability**

- 1. Across the community of researchers
  - Data collection, QA, standardized encoding and uncertainty handling protocols
  - Data exchange I/O formats & metadata
  - Data processing algorithms, code libraries
- 2. Between research facilities
  - NEON, AmeriFlux and Fluxnet common methods
  - Fully compliant metadata provisioning of NEON results to 6 partner host systems
  - Participation in meta-analyses of international CI methods, e.g. workflow objects
- 3. In active collaboration with aggregators
  - DataOne partner and metadata practitioner
  - EarthCube, CDF, ESIP, RDA coalition participants

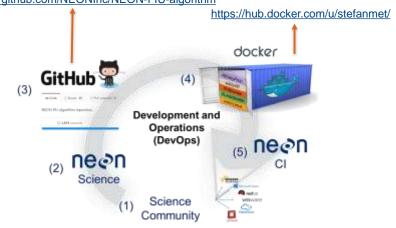




## **Data Product Collaboration (example)**



Metzger, et.al. 2017. eddy4R 0.2.0: a DevOps model for communityextensible processing and analysis of eddy-covariance data based on R, Git, Docker, and HDF5. Geosci. Model Dev., 10, 3189–3206.

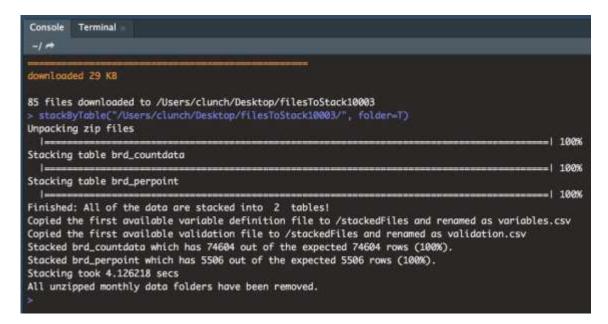


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#### Data Science Tools and Training: NEONScience on GitHub

- Open-source code packages to facilitate NEON data access and use
- Access to code used to generate NEON data products



neonUtilities R package:

- Download data from NEON API
- Merge data files from Portal or API
- Convert file format for interoperability





## Data Science Tools and Training: Tutorials & Workshops

- Advance users' data analysis skill levels
- Online tutorials for selfdirected training
- Data Institute on-site at NEON HQ
- Workshops at meetings and conferences
- Includes training in using the GitHub.com/NEONScience packages

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This is a tutorial in pulling data from the NEON AP or Application Programming Interface. The tutorial uses R and the R pockage http: but the core information about the API is applicable to other languages and approaches.

For convenience, we'll use the geodiaTDK package to make the calculations. First we'll use def\_extr.r.geo.com() to get the additional spatial information available through the API, and look at the spatial resolution available in the initial download:

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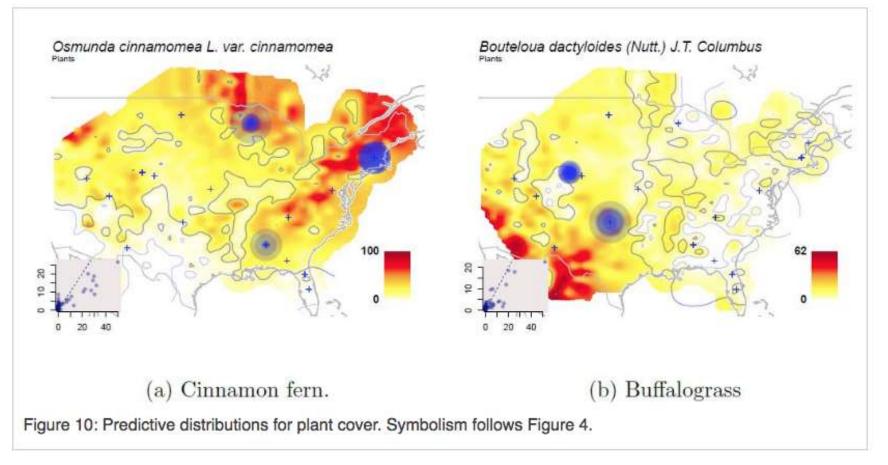
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#### User Community Projects: Predictive Distributions



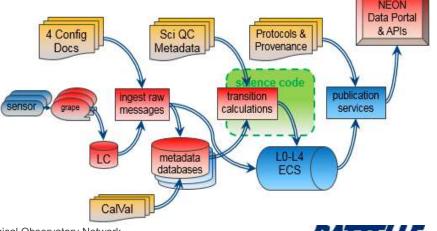
#### Clark lab: sites.duke.edu/neon/prediction





## **NEON CI Improvement Plans**

- 1. Ongoing cyberengineering support
  - e.g. better interface to manage sensor metadata; unexpected data gap checks...
- 2. Prioritized queue of CI or Data Product enhancements
  - e.g. improve minimum viable products; address tech debt; better algorithms...
- 3. Service Management continued expansion/integration
  - e.g. more workflow delegation; closer linkage with SOM & monitoring...
- 4. Asset management tools & methods assessment
  - e.g. mitigate risks of vulnerable sensor installation metadata addressing...
- 5. Proposed research & development towards VI version2
  - Redesign data acquisition hw&sw (i.e. "GRAPE" data streams)
  - Pilot optimized transition engine & DB
  - Upgrade Data Portal platform & tools
  - Evaluate CI capacity, connectivity & offsite disaster recovery options



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