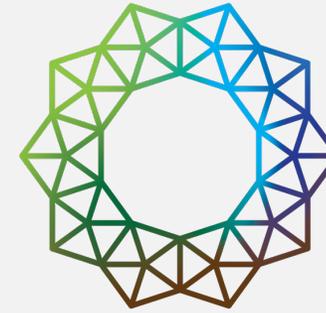


AmeriFlux BASE Data Processing Pipeline

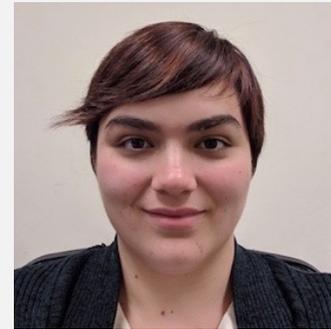


U.S. DEPARTMENT OF
ENERGY

Office of
Science



AMERIFLUX
MANAGEMENT PROJECT



Danielle S. Christianson and AmeriFlux Data Team

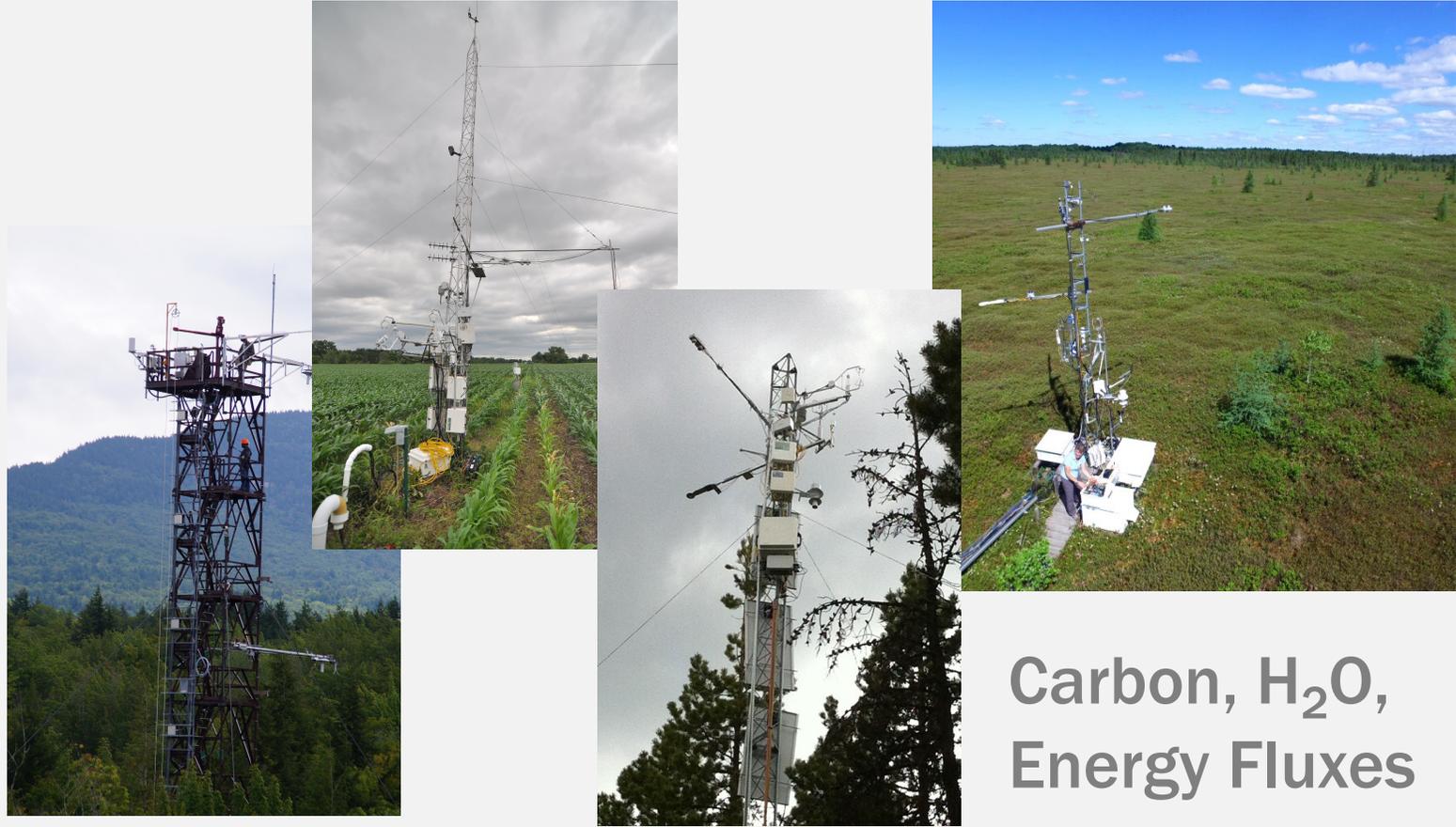
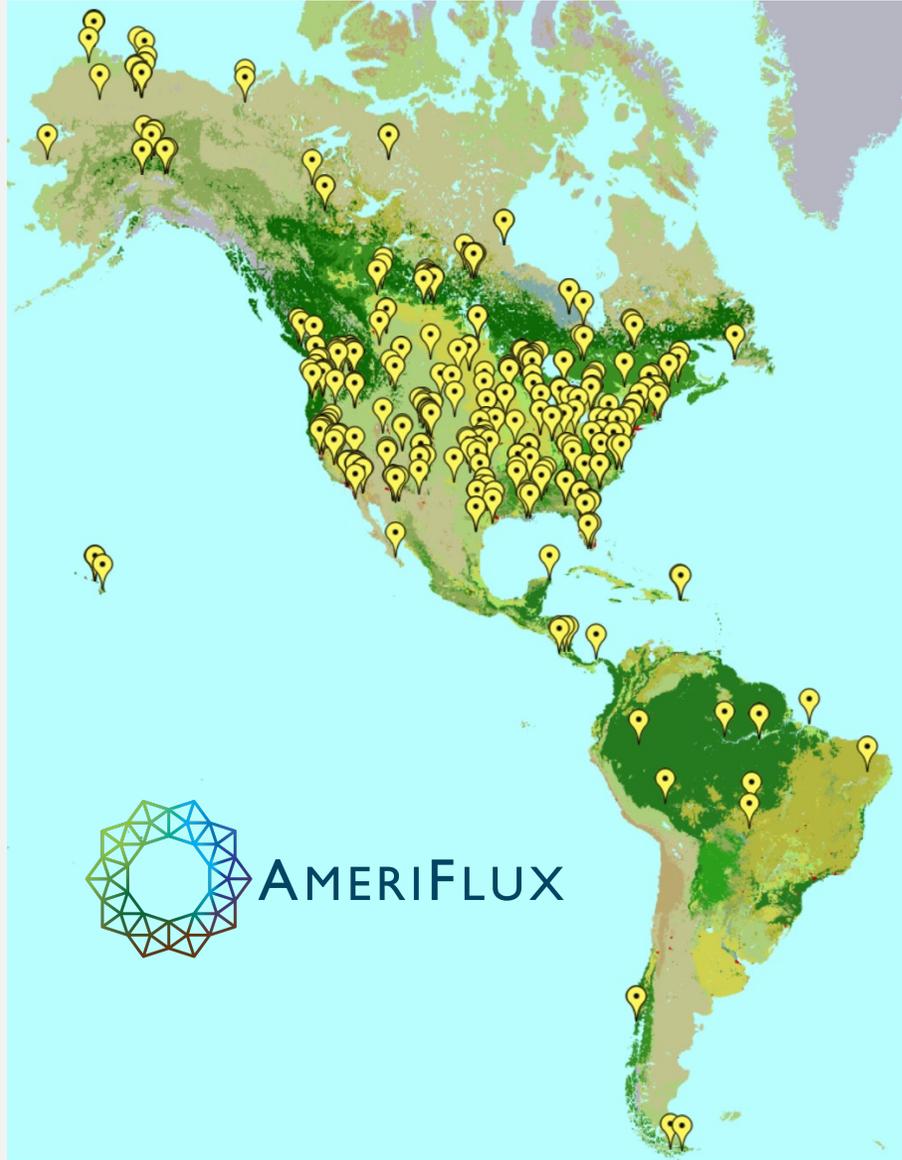
Lawrence Berkeley National Laboratory | Data Science and Technology | Computational Research Division

Cyber-Infrastructure Workshop | 29 April 2019

dschristianson@lbl.gov | ameriflux-support@lbl.gov



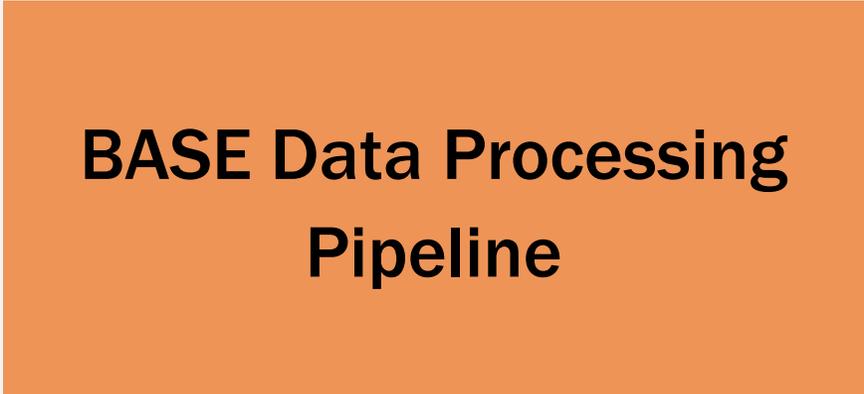
AmeriFlux is a voluntary network of independent scientists at 426 sites



AmeriFlux Data Team facilitates shared, standardized, high quality data products

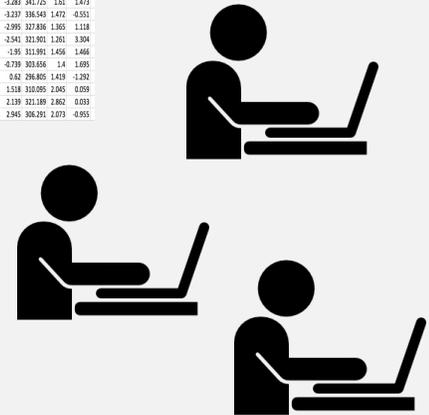


Goal: Synthesize flux-met data from across network to standard product



BASE (FP Standard)

TIMESTAMP	START	TIMESTAMP	END	CO2	FC	USTAR	TA	L	L	WD	WS	NIE	S
200401010000	200401010030	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010030	200401010100	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010100	200401010130	371.419	0.361	0.289	-1.172	108.304	1.19	0.563					
200401010130	200401010200	371.117	0.424	0.265	-1.090	124.274	1.39	0.287					
200401010200	200401010230	-9999	-9999	-9999	-1.108	-9999	-9999	-9999					
200401010230	200401010300	372.87	0.106	0.054	-2.228	8.094	1.87	-0.145					
200401010300	200401010330	373.339	0.406	0.066	-2.523	24.062	1.483	0.738					
200401010330	200401010400	373.841	1.225	0.013	-2.287	24.061	1.763	1.639					
200401010400	200401010430	374.316	0.845	0.029	-2.483	42.966	1.529	1.901					
200401010430	200401010500	-9999	-9999	-9999	-1.823	-9999	-9999	-9999					
200401010500	200401010530	374.452	0.808	0.066	-2.456	199.948	1.393	1.497					
200401010530	200401010600	-9999	-9999	-9999	-2.668	-9999	-9999	-9999					
200401010600	200401010630	375.59	1.013	0.061	-2.096	343.960	1.548	2.051					
200401010630	200401010700	378.311	0.78	0.034	-3.377	311.023	1.015	3.541					
200401010700	200401010730	382.117	0.49	0.117	-3.283	341.725	1.61	1.473					
200401010730	200401010800	380.643	0.642	0.127	-3.237	336.543	1.472	-0.551					
200401010800	200401010830	379.306	0.767	0.113	-2.995	327.836	1.365	1.118					
200401010830	200401010900	381.477	1.780	0.137	-3.541	311.901	1.261	3.304					
200401010900	200401010930	382.918	1.554	0.217	-1.95	311.991	1.458	1.466					
200401010930	2004010101000	381.267	2.239	0.279	-0.739	303.656	1.4	1.695					
2004010101000	2004010101030	381.616	-0.077	0.311	0.62	296.805	1.419	-1.292					
2004010101030	2004010101100	378.344	2.476	0.55	1.518	310.095	2.045	0.059					
2004010101100	200401011130	375.78	1.397	0.566	2.139	311.189	1.862	0.913					
200401011130	200401011200	375.55	-0.229	0.532	2.945	306.291	2.073	-0.955					

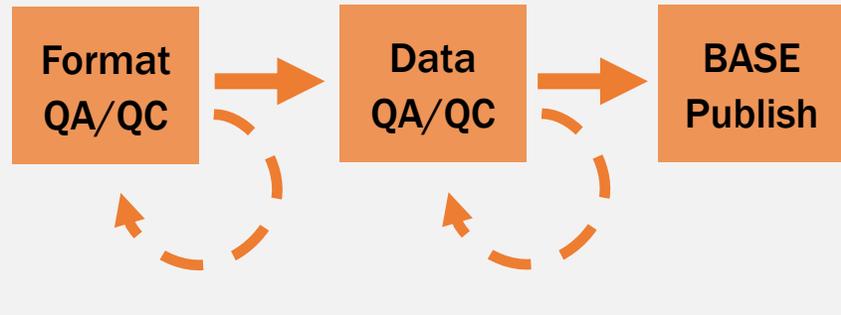




Modular processing components

BASE-In (FP-In)

TIMESTAMP	START	TIMESTAMP	END	CC2	FC	USTAR	TA	L	WD	WS	NIE	S
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	371.419	0.561	0.599	-1.172	108.304	1.19	0.563				
200401010000	200401010000	371.157	0.424	0.165	-1.049	124.224	1.39	-0.287				
200401010000	200401010000	-9999	-9999	-9999	-1.109	-9999	-9999	-9999				
200401010000	200401010000	372.87	0.106	0.054	-2.228	8.094	1.387	-0.145				
200401010000	200401010000	373.339	0.406	0.066	-2.525	24.062	1.483	0.738				
200401010000	200401010000	373.661	1.225	0.013	-2.287	24.261	1.763	1.639				
200401010000	200401010000	374.265	1.847	0.020	-2.483	42.556	1.239	1.395				
200401010000	200401010000	-9999	-9999	-9999	-1.829	-9999	-9999	-9999				
200401010000	200401010000	374.452	0.508	0.066	-2.456	195.948	1.393	1.497				
200401010000	200401010000	-9999	-9999	-9999	-2.668	-9999	-9999	-9999				
200401010000	200401010000	375.59	1.015	0.061	-2.986	342.969	1.548	2.051				
200401010000	200401010000	378.311	0.78	0.024	-3.377	311.023	1.015	3.541				
200401010000	200401010000	382.137	0.49	0.117	-3.283	341.725	1.61	1.473				
200401010000	200401010000	380.643	0.642	0.127	-3.237	336.543	1.472	-0.551				
200401010000	200401010000	379.306	0.767	0.113	-2.955	327.836	1.365	1.118				
200401010000	200401010000	381.477	1.785	0.137	-2.541	321.901	1.261	3.004				
200401010000	200401010000	382.918	1.554	0.217	-1.95	311.901	1.456	1.466				
200401010000	200401010000	381.267	2.239	0.279	-6.739	303.656	1.4	1.695				
200401010000	200401010000	381.616	-0.077	0.352	0.62	296.805	1.419	-1.292				
200401010000	200401010000	378.344	2.476	0.55	1.518	310.095	2.045	0.059				
200401010000	200401010000	375.78	1.187	0.566	2.139	321.189	2.862	0.053				
200401010000	200401010000	375.55	-0.229	0.522	2.945	306.291	2.073	-0.955				



BASE (FP Standard)

TIMESTAMP	START	TIMESTAMP	END	CC2	FC	USTAR	TA	L	WD	WS	NIE	S
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	371.419	0.561	0.599	-1.172	108.304	1.19	0.563				
200401010000	200401010000	371.157	0.424	0.165	-1.049	124.224	1.39	-0.287				
200401010000	200401010000	-9999	-9999	-9999	-1.109	-9999	-9999	-9999				
200401010000	200401010000	372.87	0.106	0.054	-2.228	8.094	1.387	-0.145				
200401010000	200401010000	373.339	0.406	0.066	-2.525	24.062	1.483	0.738				
200401010000	200401010000	373.661	1.225	0.013	-2.287	24.261	1.763	1.639				
200401010000	200401010000	374.265	1.847	0.020	-2.483	42.556	1.239	1.395				
200401010000	200401010000	-9999	-9999	-9999	-1.829	-9999	-9999	-9999				
200401010000	200401010000	374.452	0.508	0.066	-2.456	195.948	1.393	1.497				
200401010000	200401010000	-9999	-9999	-9999	-2.668	-9999	-9999	-9999				
200401010000	200401010000	375.59	1.015	0.061	-2.986	342.969	1.548	2.051				
200401010000	200401010000	378.311	0.78	0.024	-3.377	311.023	1.015	3.541				
200401010000	200401010000	382.137	0.49	0.117	-3.283	341.725	1.61	1.473				
200401010000	200401010000	380.643	0.642	0.127	-3.237	336.543	1.472	-0.551				
200401010000	200401010000	379.306	0.767	0.113	-2.955	327.836	1.365	1.118				
200401010000	200401010000	381.477	1.785	0.137	-2.541	321.901	1.261	3.004				
200401010000	200401010000	382.918	1.554	0.217	-1.95	311.901	1.456	1.466				
200401010000	200401010000	381.267	2.239	0.279	-6.739	303.656	1.4	1.695				
200401010000	200401010000	381.616	-0.077	0.352	0.62	296.805	1.419	-1.292				
200401010000	200401010000	378.344	2.476	0.55	1.518	310.095	2.045	0.059				
200401010000	200401010000	375.78	1.187	0.566	2.139	321.189	2.862	0.053				
200401010000	200401010000	375.55	-0.229	0.522	2.945	306.291	2.073	-0.955				





Towards full automation: Format QA/QC on-line report

QA/QC Report: Format

This report details results of the AmeriFlux QA/QC data processing pipeline.

For more information, see [How to Read This Report](#), [QA/QC Status Definitions](#), and [Upload Format Instructions](#)

PASS

Autocorrections made. Review recommended.

No further action needed if Autocorrected file is OK.

The following automated corrections were attempted. Please review.
No further action needed if corrections are OK. Upload a new file if something is amiss.

- Changed 269876 missing values to -9999 from 234740 instances of -9999.000000 and 35136 instances of NaN.
- File was autocorrected and Autocorrected file uploaded.

WARNING

Autocorrected File: US-Ton_HH_200401010000_200501010000.csv

Report ID: 27182

Site ID: US-Ton

Site contact: Dennis Baldocchi

Uploader: Format QAQC Pipeline

Upload date: 2018-Oct-23 13:30

Uploaded filename: US-Ton_HH_200401010000_200501010000-2018102313314376.csv

Format QA/QC report summary:

All format QA/QC checks attempted. In most cases, data will be queued for further data processing. See Format QA/QC report email for additional details.

Processing code version: 0.4.27

Processing log file: http://ameriflux-data.lbl.gov/QAQCLogs/QAQC_report_US-Ton_27182_20181023134757.log

Variable names found in the file:

TIMESTAMP_START, TIMESTAMP_END, FC_1_1_1, CO2_1_1_1, CO2_SIGMA_1_1_1, LE_1_1_1, H2O_1_1_1, H2O_SIGMA_1_1_1, H_1_1_1, T_SONIC_1_1_1, T_SONIC_SIGMA_1_1_1, WD_1_1_1, WS_1_1_1, USTAR_1_1_1, W_SIGMA_1_1_1, U_SIGMA_1_1_1, V_SIGMA_1_1_1, TA_1_1_1, VPD_1_1_1, RH_1_1_1, PA, TS_1_1_A, TS_1_2_A, TS_1_3_A, TS_1_4_A, TS_1_5_A, SWC_1_1_A, SWC_1_2_A, SWC_1_3_A, P, ZL_1_1_1, G_1_1_A, NETRAD_1_1_1, SW_IN_1_1_1,

Test	Result(s)	Additional Information
Any Variables suspected gap-fill?	WARNING	These variables are suspected to be gap-filled because they have no missing values: H2O_1_1_1, H2O_SIGMA_1_1_1, RH_1_1_1, PA, SWC_1_1_A, SWC_1_2_A, SWC_1_3_A, P, PPFD_IN_1_1_1, H2O_SIGMA_1_2_1, VPD_1_2_1, RH_1_2_1
Any Variables with ALL Data Missing?	WARNING	These variables have all data missing: SW_IN_1_1_1, PPFD_OUT_1_1_1, SW_IN_1_1_2, SW_OUT_1_1_1, LW_IN_1_1_1, LW_OUT_1_1_1, PPFD_DIR_1_1_1, PPFD_DIF_1_1_1. Previously uploaded data with the same time period will be overwritten.



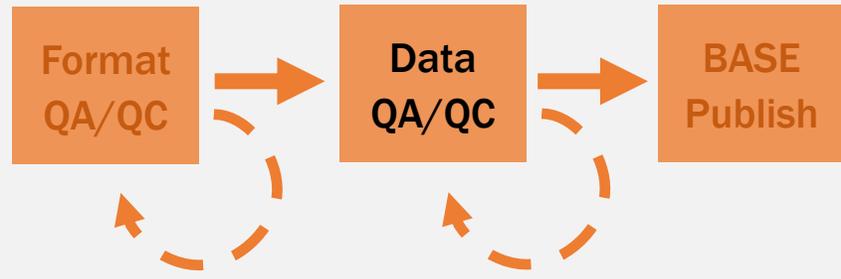
Data QA/QC checks data issues

BASE-In
(FP-In)

TIMESTAMP_START	TIMESTAMP_END	CC2	FC	USTAR	TA	L	WD	WS	NIE	S
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	371.419	0.561	0.599	-1.172	108.304	1.19	0.563		
200401010000	200401010000	371.157	0.424	0.165	-1.049	124.224	1.39	-0.287		
200401010000	200401010000	-9999	-9999	-9999	-1.109	-9999	-9999	-9999		
200401010000	200401010000	372.87	0.106	0.054	-2.228	8.094	1.387	-0.145		
200401010000	200401010000	373.339	0.406	0.066	-2.525	24.062	1.483	0.738		
200401010000	200401010000	373.661	1.225	0.013	-2.287	24.261	1.763	1.639		
200401010000	200401010000	374.266	1.847	0.026	-2.483	42.356	1.239	1.935		
200401010000	200401010000	-9999	-9999	-9999	-1.829	-9999	-9999	-9999		
200401010000	200401010000	374.452	0.908	0.066	-2.456	199.948	1.393	1.497		
200401010000	200401010000	-9999	-9999	-9999	-2.668	-9999	-9999	-9999		
200401010000	200401010000	375.59	1.015	0.061	-2.386	342.969	1.548	2.051		
200401010000	200401010000	378.311	1.78	0.024	-3.377	311.023	1.015	3.541		
200401010000	200401010000	382.137	0.49	0.117	-3.283	341.725	1.61	1.473		
200401010000	200401010000	380.643	0.642	0.117	-3.237	336.543	1.472	-0.551		
200401010000	200401010000	379.306	0.767	0.113	-2.995	327.836	1.365	1.118		
200401010000	200401010000	381.477	1.785	0.137	-2.541	321.901	1.261	3.304		
200401010000	200401010000	382.918	1.554	0.217	-1.95	311.991	1.466	1.466		
200401010000	200401010000	381.267	2.239	0.279	-6.739	303.656	1.4	1.695		
200401010000	200401010000	381.616	-0.077	0.352	0.62	296.805	1.419	-1.292		
200401010000	200401010000	378.344	2.476	0.55	1.518	310.095	2.045	0.059		
200401010000	200401010000	375.78	1.187	0.566	2.139	321.189	2.862	0.053		
200401010000	200401010000	375.55	-0.229	0.532	2.945	306.291	2.073	-0.955		



Does data pass quality checks?



BASE
(FP Standard)

TIMESTAMP_START	TIMESTAMP_END	CC2	FC	USTAR	TA	L	WD	WS	NIE	S
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999	-9999
200401010000	200401010000	371.419	0.561	0.599	-1.172	108.304	1.19	0.563		
200401010000	200401010000	371.157	0.424	0.165	-1.049	124.224	1.39	-0.287		
200401010000	200401010000	-9999	-9999	-9999	-1.109	-9999	-9999	-9999		
200401010000	200401010000	372.87	0.106	0.054	-2.228	8.094	1.387	-0.145		
200401010000	200401010000	373.339	0.406	0.066	-2.525	24.062	1.483	0.738		
200401010000	200401010000	373.661	1.225	0.013	-2.287	24.261	1.763	1.639		
200401010000	200401010000	374.266	1.847	0.026	-2.483	42.356	1.239	1.935		
200401010000	200401010000	-9999	-9999	-9999	-1.829	-9999	-9999	-9999		
200401010000	200401010000	374.452	0.908	0.066	-2.456	199.948	1.393	1.497		
200401010000	200401010000	-9999	-9999	-9999	-2.668	-9999	-9999	-9999		
200401010000	200401010000	375.59	1.015	0.061	-2.386	342.969	1.548	2.051		
200401010000	200401010000	378.311	1.78	0.024	-3.377	311.023	1.015	3.541		
200401010000	200401010000	382.137	0.49	0.117	-3.283	341.725	1.61	1.473		
200401010000	200401010000	380.643	0.642	0.117	-3.237	336.543	1.472	-0.551		
200401010000	200401010000	379.306	0.767	0.113	-2.995	327.836	1.365	1.118		
200401010000	200401010000	381.477	1.785	0.137	-2.541	321.901	1.261	3.304		
200401010000	200401010000	382.918	1.554	0.217	-1.95	311.991	1.466	1.466		
200401010000	200401010000	381.267	2.239	0.279	-6.739	303.656	1.4	1.695		
200401010000	200401010000	381.616	-0.077	0.352	0.62	296.805	1.419	-1.292		
200401010000	200401010000	378.344	2.476	0.55	1.518	310.095	2.045	0.059		
200401010000	200401010000	375.78	1.187	0.566	2.139	321.189	2.862	0.053		
200401010000	200401010000	375.55	-0.229	0.532	2.945	306.291	2.073	-0.955		



All data years are combined.

Assessment includes:

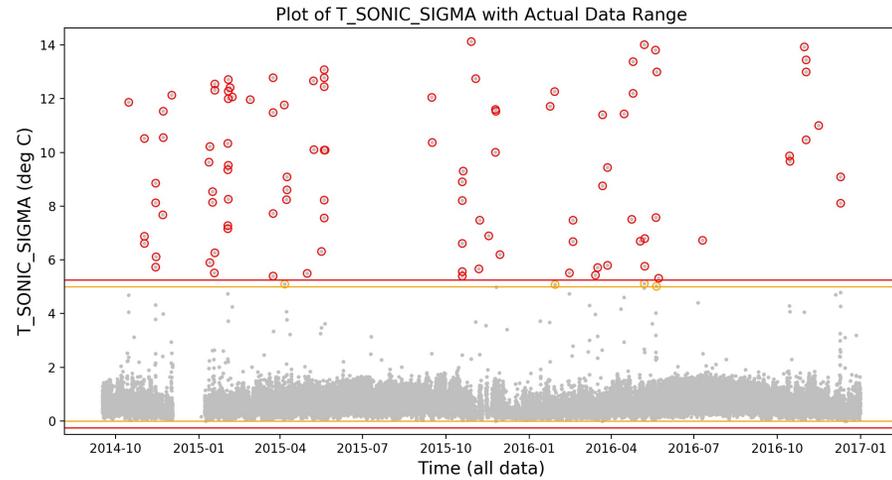
- Outliers, units
- Seasonal / Daily time shifts
- Multivariate comparisons
- Technique specific checks (e.g., u* filtering)



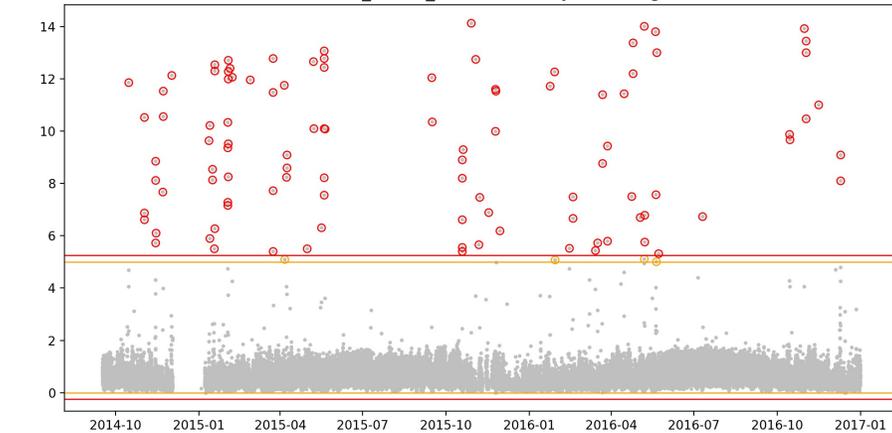
Automated figures

Variable name	% of data present								
	1	2	3	4	5	6	7	8	9
CO2	40.5	48.2	44.0	67.5	91.7	90.1	90.3	82.7	72.5
H2O	41.7	49.1	45.5	68.5	91.7	90.1	90.3	82.7	72.5
CH4	14.2	40.4	40.8	63.1	94.3	87.9	94.5	89.9	75.8
FC	46.4	57.2	52.2	57.9	71.8	66.0	64.3	58.4	32.4
FCH4	23.2	55.0	56.5	56.9	75.6	67.9	68.7	64.8	36.2
FC_SSITC_TEST	65.9	87.9	87.7	91.3	92.4	92.2	90.9	90.1	83.0
FCH4_SSITC_TEST	30.4	76.8	83.5	88.5	94.3	89.9	94.8	93.2	84.7
G	53.1	81.4	87.7	77.5	83.8	89.8	76.6	70.7	91.4
H	56.5	69.3	65.8	71.2	82.1	75.4	73.7	69.1	44.2
LE	50.7	64.1	59.2	65.4	77.1	72.4	70.7	63.3	35.8
H_SSITC_TEST	65.9	87.9	87.7	95.7	100.0	100.0	100.0	100.0	99.8
LE_SSITC_TEST	65.9	87.9	87.7	91.3	92.4	92.2	90.9	90.1	83.0
WD	70.8	99.9	94.5	91.5	99.9	97.9	99.6	96.6	91.1
WS	70.8	99.9	94.5	91.5	99.9	97.9	99.6	96.6	91.1
USTAR	70.8	99.9	94.5	91.5	99.9	97.9	99.6	96.6	91.1
ZL	56.9	69.3	65.8	71.4	82.9	75.9	74.4	69.5	45.0
TAU	44.5	51.3	48.7	73.0	99.1	97.6	99.2	96.3	90.8

Physical Range of T_SONIC_SIGMA throughout all data



Plot of T_SONIC_SIGMA with Physical Range



— Expected Range (0.0-5.0) ○ data outside the expected physical range
— Expected Range +/- 5.0% (-0.25-5.25) ○ data outside the expected physical range
● data



Automated figures with manual synthesis (via Issue Tracker)

Variable name

CO2
H2O
CH4
FC
FCH4
FC_SSITC_TEST
FCH4_SSITC_TEST
G
H
LE
H_SSITC_TEST
LE_SSITC_TEST
WD
WS
USTAR
ZL
TAU

QAQC-1145
[Return to queue](#)

Data Results | US-ADR HH 20110101 - 20170523 | Using uploads through Dec 06, 2017

Edit
Comment
Assign
More ▾
Undo
Admin ▾

Export ▾

Details

Type:	🔴 Data QAQC Results	Status:	🟢 PUBLISHABLE (View Workflow)
Priority:	🔼 Medium	Resolution:	Unresolved
Affects Version/s:	None	Fix Version/s:	None
Component/s:	None		
Labels:	Results_Sent ✎		
Process ID(s):	11086		
Site ID:	US-ADR		
Temporal Resolution:	HH		
Report Link:	http://ameriflux.lbl.gov/qaqc-report/?site_id=US-ADR&report_id=11086		
FTP Link:	ftp://ftp.fluxdata.org/.ameriflux_downloads/data/.US-ADR_9403460/11086/output		
sandbox:	*[DATA QA/QC]*		

Description

QAQC completed with the following results critical(0), error(12), warning(6), ok(63)

Attachments

📁 Drop files to attach, or [browse](#).

Issue Links

updates	🔴 QAQC-1091 Data Results US-ADR HH 20110101 - 20170523...	🔼	REPLACE WIT...
has/had issue	📄 QAQC-1107 Constant (gap-filled) PA 2011-2015	🔼	FIXED
	📄 QAQC-1108 Invalid missing values in SWC (2014, 2016, 2017)	🔼	FIXED
has Format QA/QC	🔵 QAQC-1144 Format Results - Review requested US-ADR dat...	🔼	ATTEMPT DAT...

SLAs

-15:03 ⏱ Time to resolution within 24h 📅

6:28 ✓ Time to first response within 8h 📅

People

Assignee: 👤 Unassigned
[Assign to me](#)

Reporter: 👤 Michael T. Moreo

Request participants: 👤 andraski@usgs.gov

Organizations: 👤 US-ADR

Votes: 🗳 0 [Vote for this issue](#)

Watchers: 👤 0 [Start watching this issue](#)

Service Desk request

Request type: 🔴 Data QAQC

Customer status: Publishable

Channel: JIRA

[View customer request](#) 📄

Dates

Created: 07/Dec/17 10:27 AM

Updated: 07/Dec/17 11:58 AM



No off-the-shelf-solution → multicomponent software stack



Metadata management, data processing tracking



Python Data processing



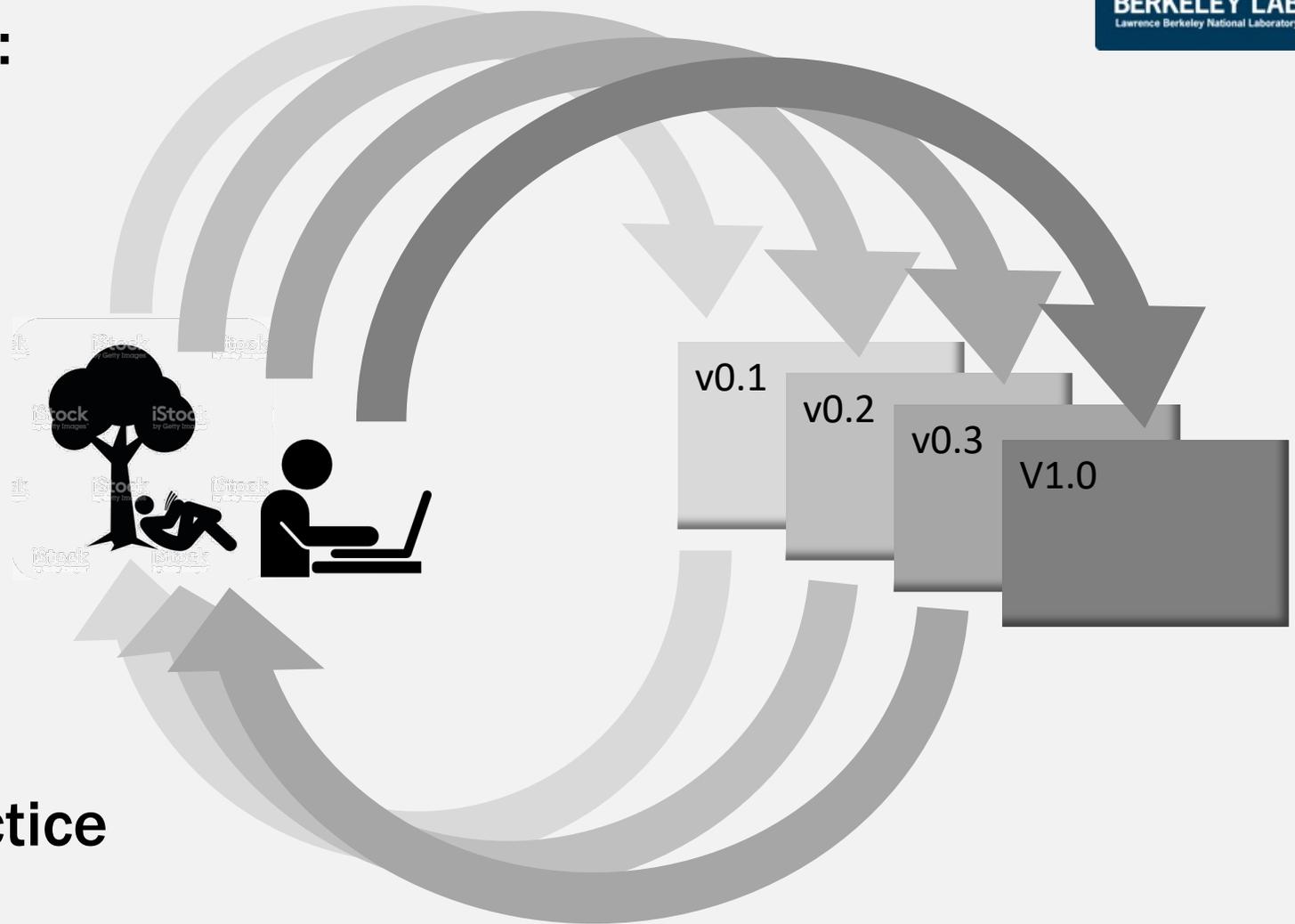
JIRA Service Desk Communications, some data processing tracking

Javascript, PHP front end Static communication, data upload / download

MS WCF & WebAPI Webservices Communication between system components

Earth science data challenges:

- Data **DIVERSITY**
- Standards
- Metadata / Data reporting
- Provenance / Archiving
- Attribution



We need more / better tools
AND change in science practice

We use scientist-centered design approach + agile development