

WORKFLOWS FOR DATA INTENSIVE GROUNDWATER ASSESSMENT

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Gordon MacMillan | Jens Schumacher

PRESENTATION OUTLINE

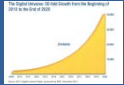
- Introduction
- Tools and Workflows
- Conclusion



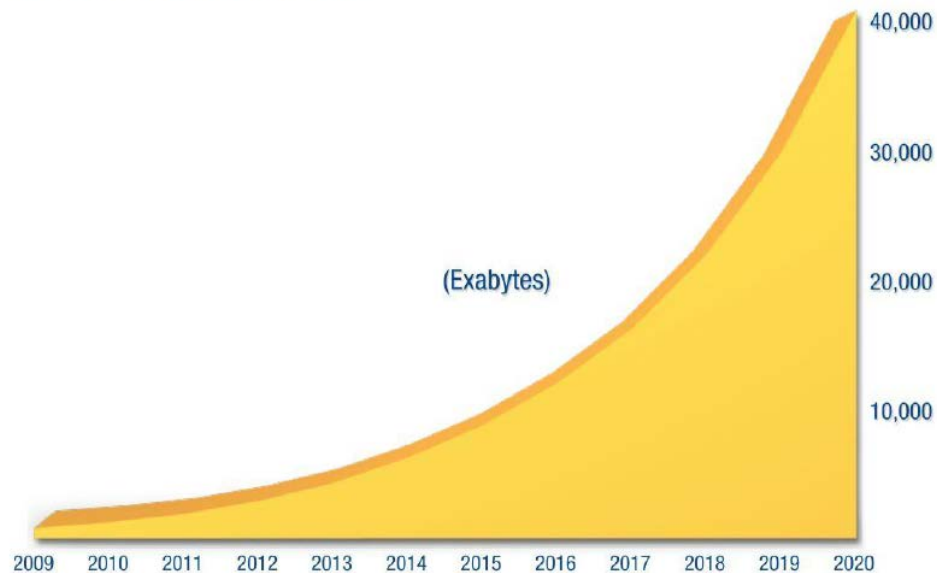


INTRODUCTION – WHY?

Big Data



The Digital Universe: 50-fold Growth from the Beginning of 2010 to the End of 2020



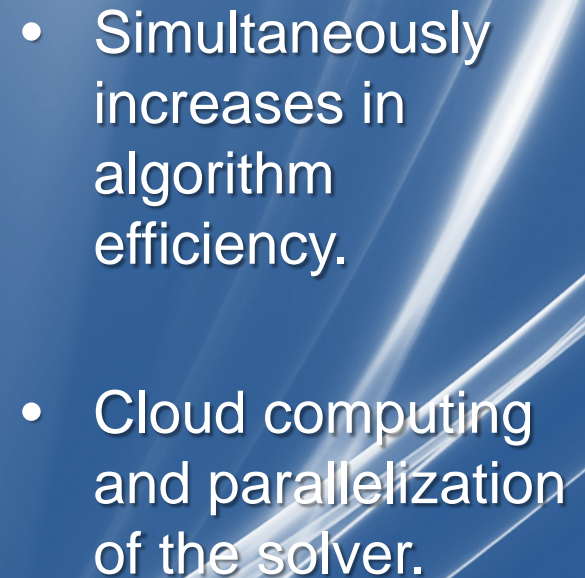
Source: IDC's Digital Universe Study, sponsored by EMC, December 2012

Decimal		
Value		Metric
1000	kB	kilobyte
1000 ²	MB	megabyte
1000 ³	GB	gigabyte
1000 ⁴	TB	terabyte
1000 ⁵	PB	petabyte
1000 ⁶	EB	exabyte
1000 ⁷	ZB	zettabyte
1000 ⁸	YB	yottabyte





CPU/Algorithm/Cloud





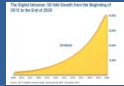
Scientist Skills



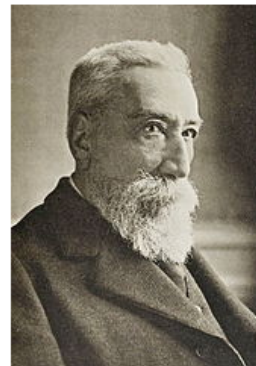
INTRODUCTION – WHY?

Big Data

CPU/Algorithm/Cloud



Anatole France, Updated



Anatole France (1844-1924)

Then

The law, in its majestic equality, forbids the rich and poor alike to sleep under bridges, to beg in the streets, and to steal bread.

Now

The Internet, in its majestic equality, allows every scientist to analyze massive data sets using web services and cloud computing.

Originally posted 2014-03-07 by Greg Wilson in Opinion.

Greg Wilson

The Mozilla Foundation → open internet

Software Carpentry → <http://software-carpentry.org>





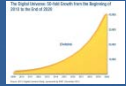
Scientist Skills



INTRODUCTION – WHY?

Big Data

CPU/Algorithm/Cloud



Some of the challenges are:

- Capacity to store raw data
- Capacity to search, aggregate, filter, Qa/Qc, and cross-reference data sets
- Repeatability

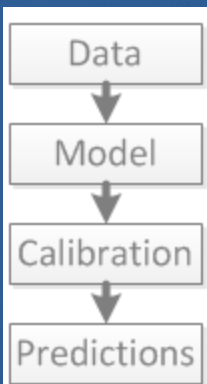
AND

- Clients, regulators, stakeholders expectations.



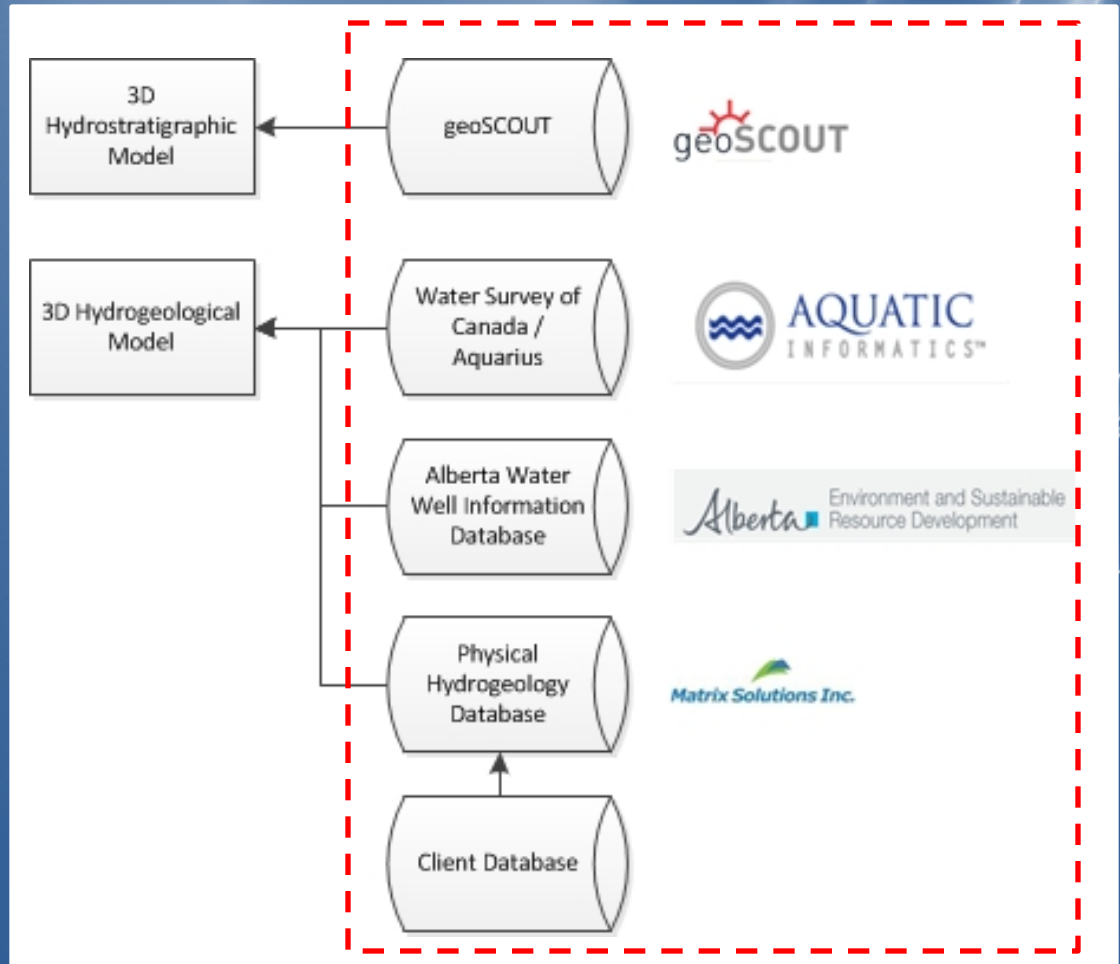
WORKFLOWS FOR DATA INTENSIVE GROUNDWATER ASSESSMENT – TOOLS FROM SOFTWARE ARCHITECTURE AND SOFTWARE ENGINEERING

- Databases
- Python Scripts
- Matrix's PEST Graphical User Interface (GUI)
- Cloud Computing
- Version Control System



DATABASES

- Geology Dataset
- Hydraulic Heads
- Withdrawal and Disposal Rates
 - Reported
 - Planned
- Surface Water Gauge



Data

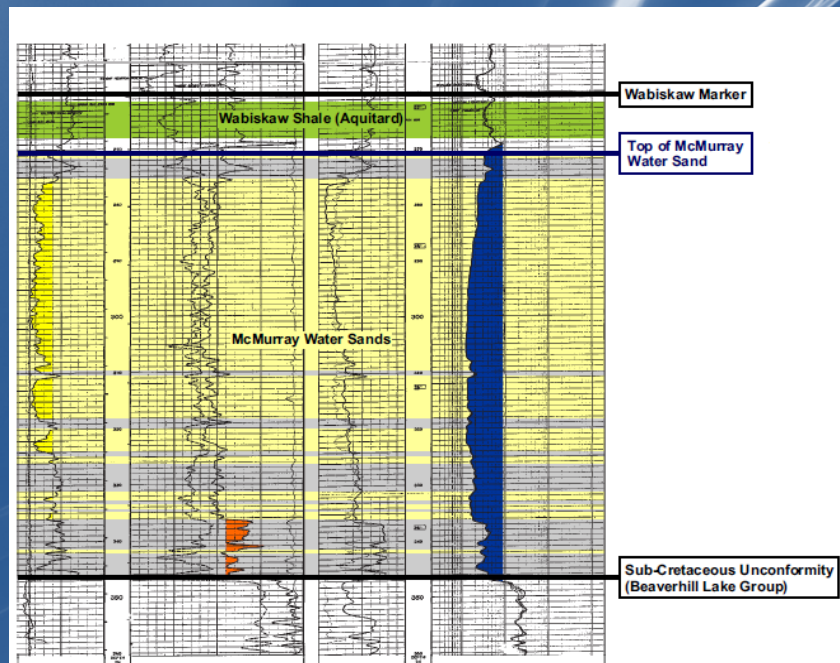
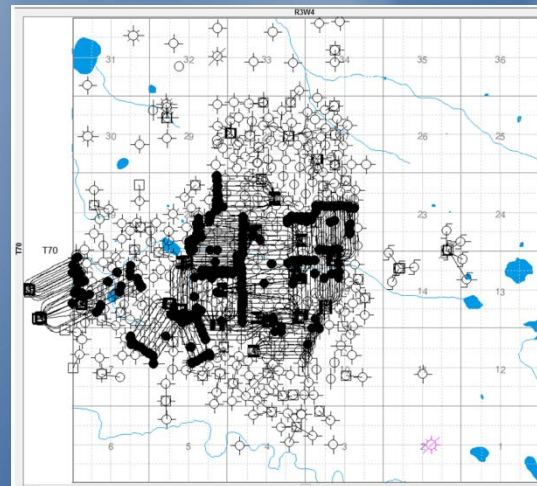
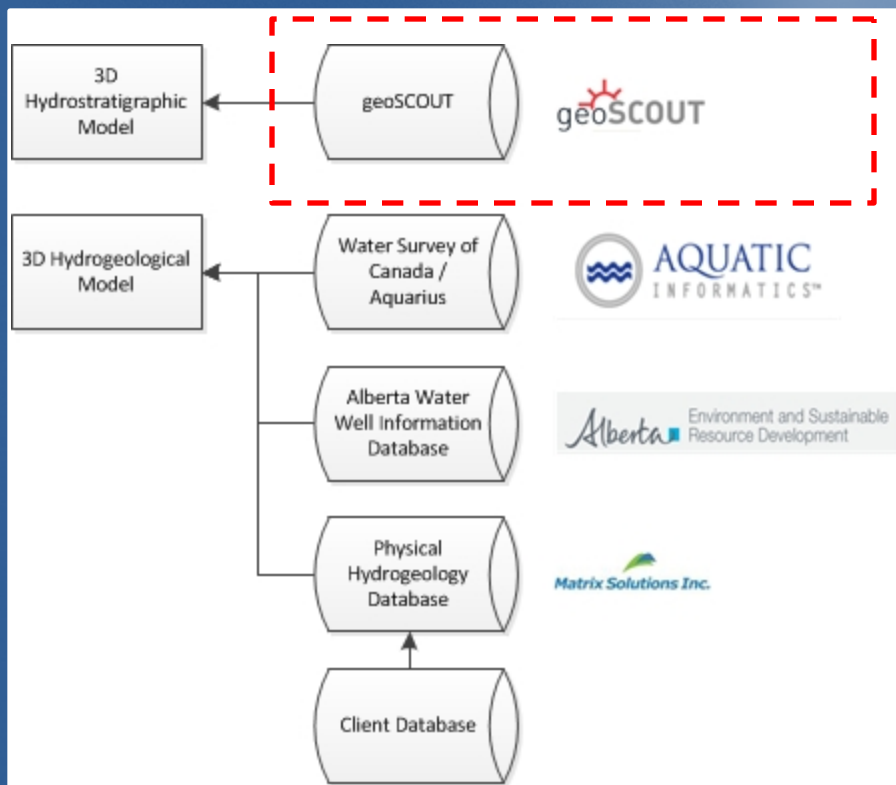
Model

Calibration

Predictions



GEOSCOUT



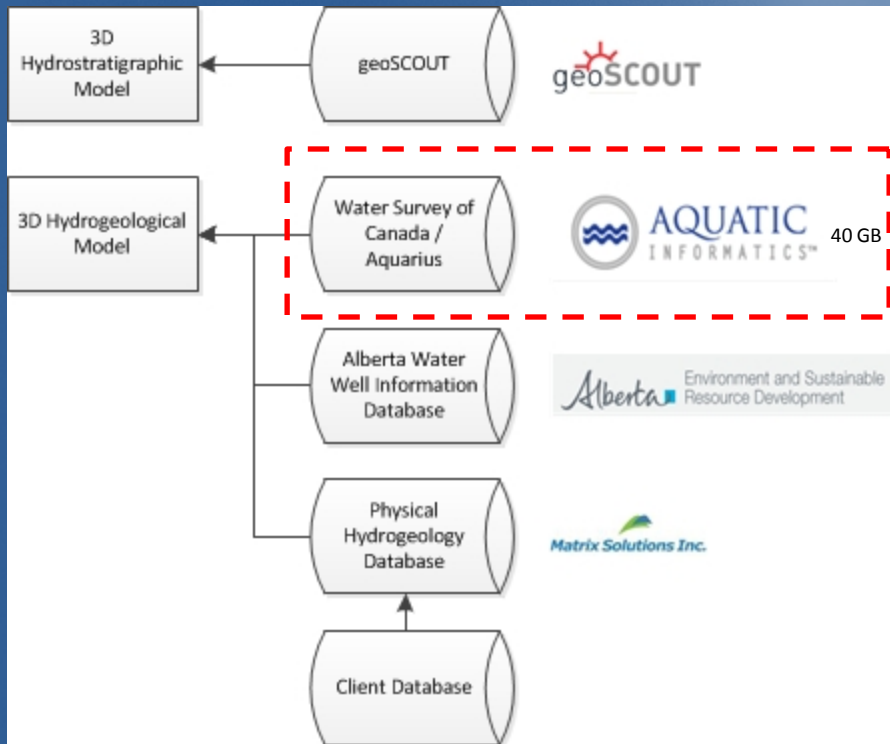
Data

Model

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Predictions

AQUARIUS



BOW RIVER AT CALGARY [AB] (05BH004)

Data Category: Real Time

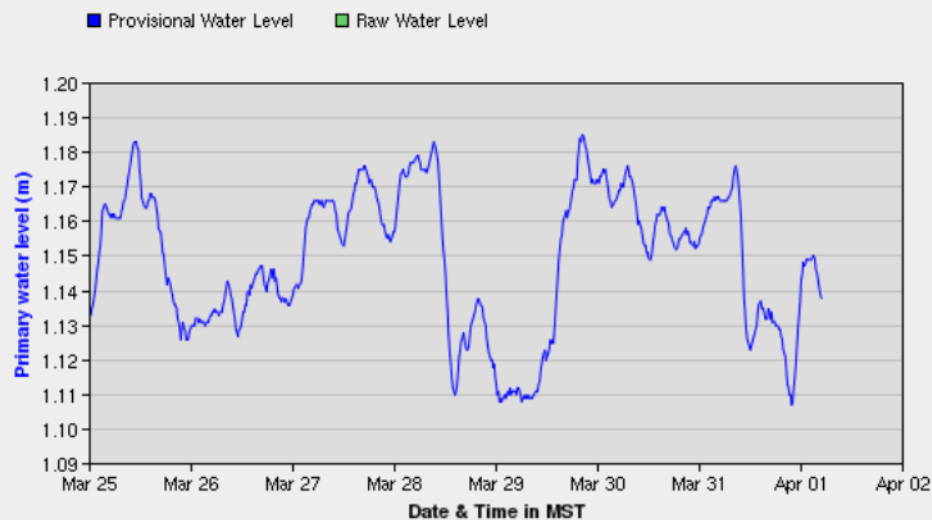
Go

Tabular Data

Parameter Type: Primary water level

(Second Parameter)

Redraw



Data

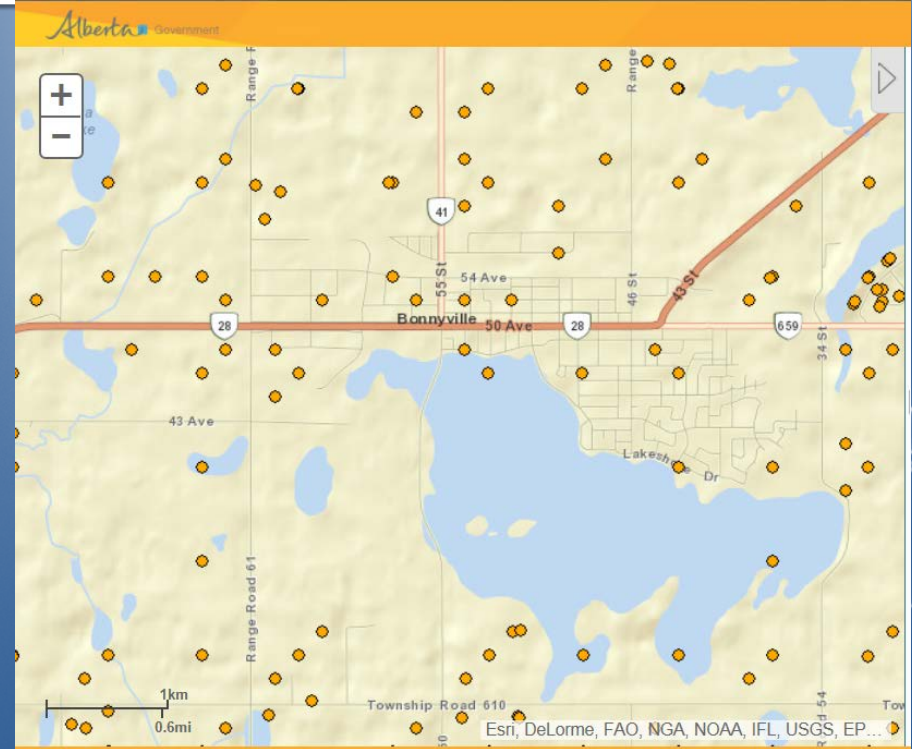
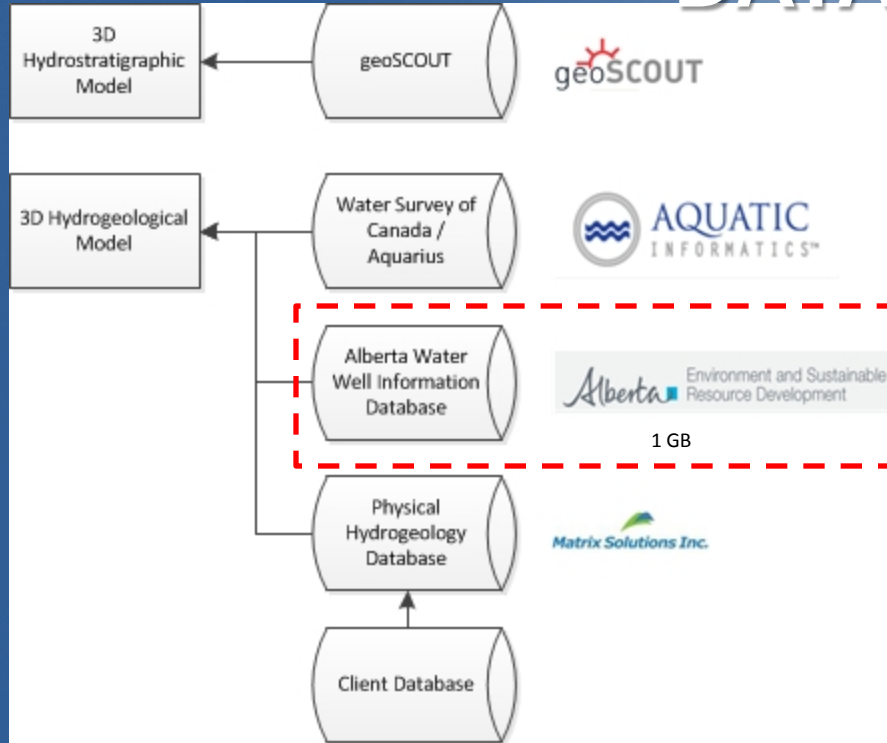
Model

Calibration

Predictions



ALBERTA WATER WELL INFORMATION DATABASE



Data

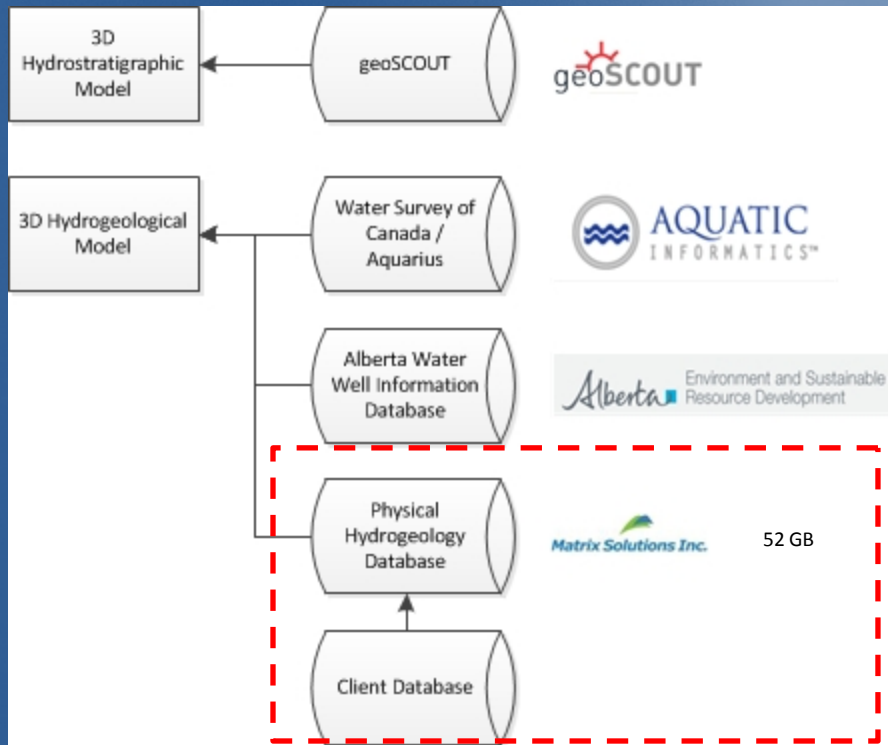
Model

Calibration

Predictions



MATRIX'S - PHYSICAL HYDROGEOLOGY DATABASE



The [Australian National Groundwater Data Transfer Standard](#) Web Site

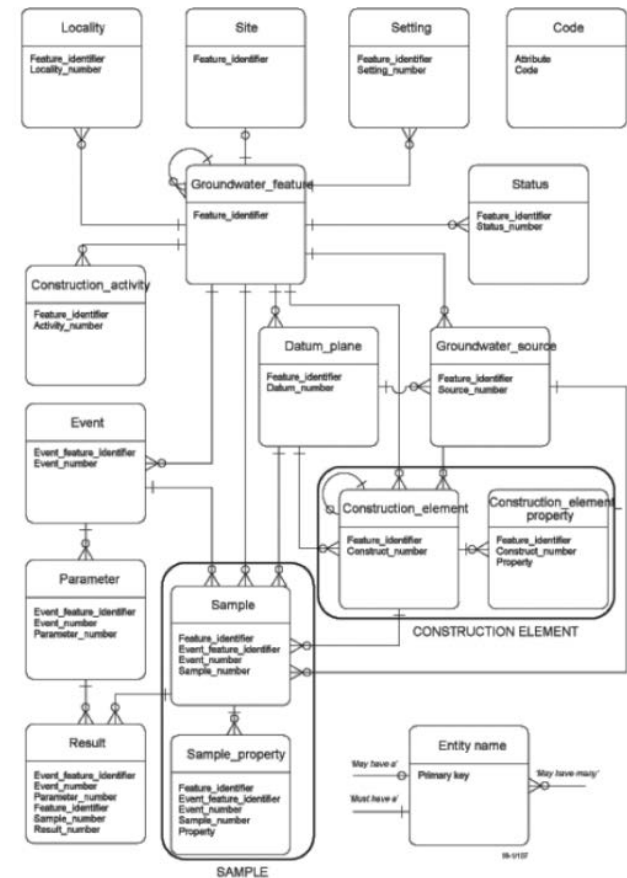


Figure 2.1 Entity Relationship (ER) Diagram for the standard groundwater data model

Data

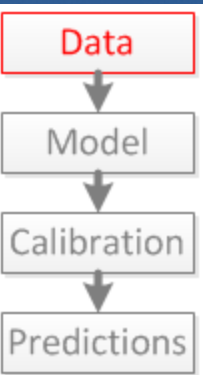
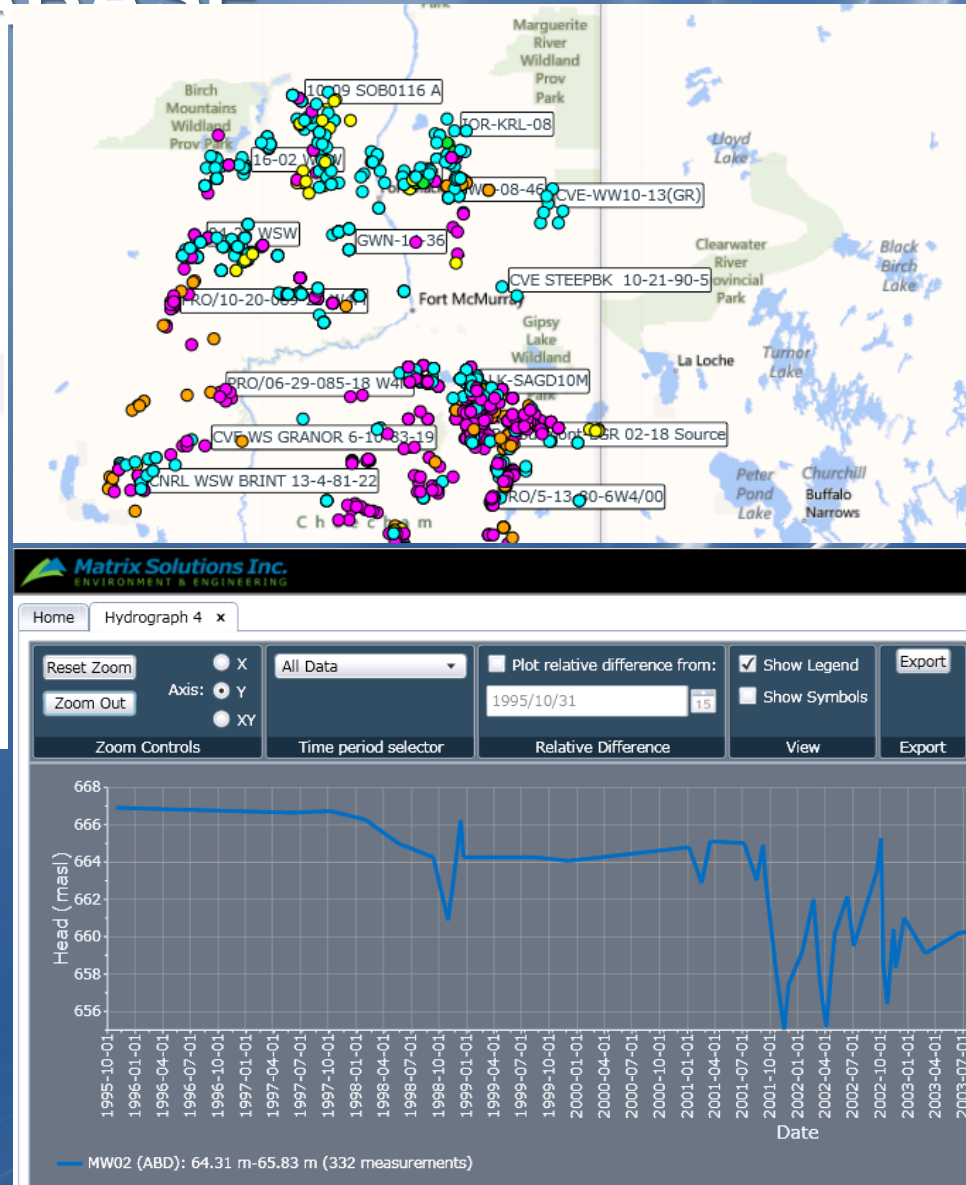
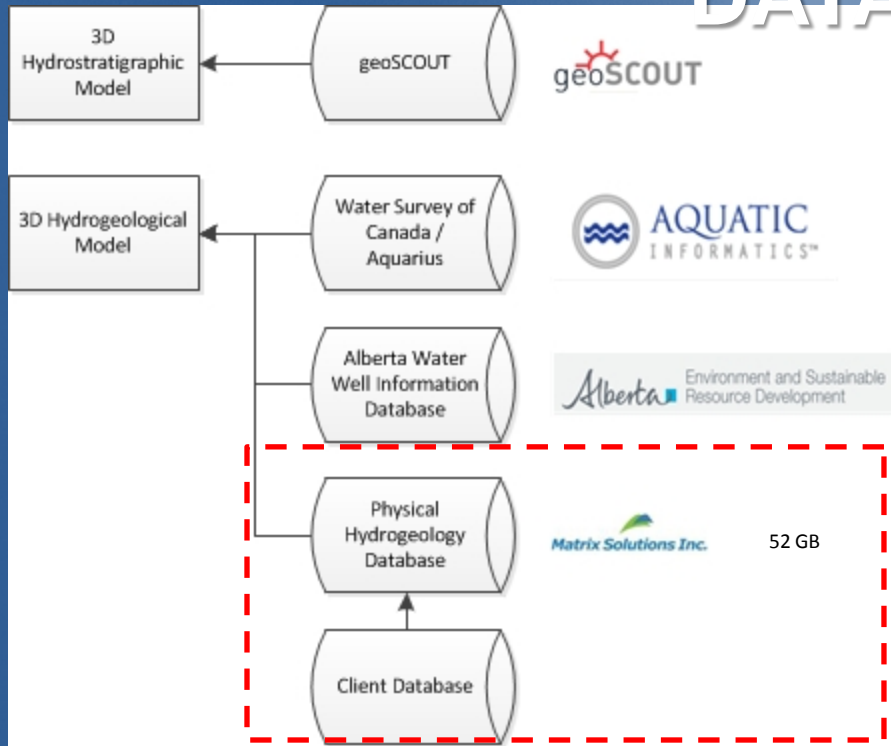
Model

Calibration

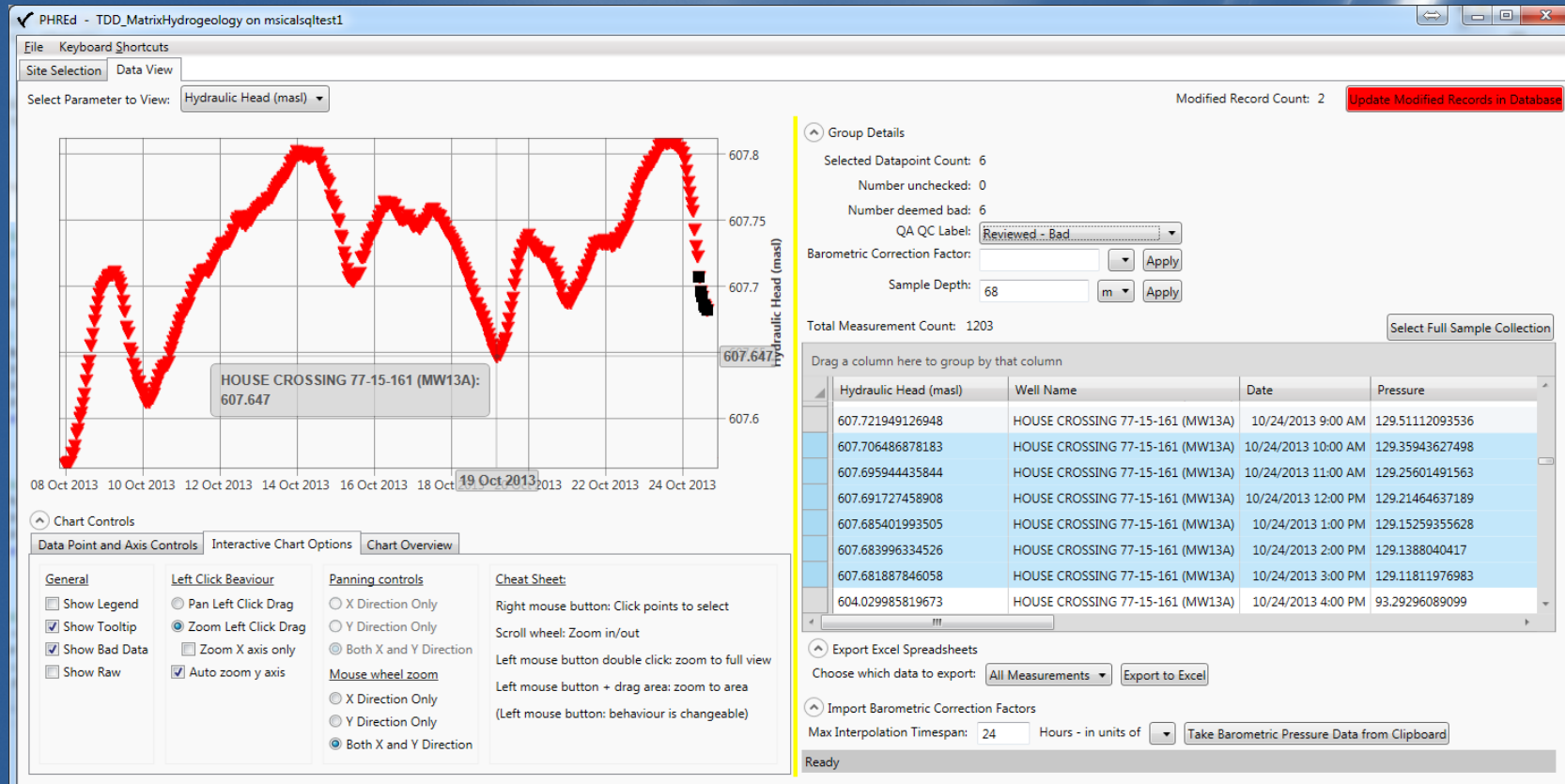
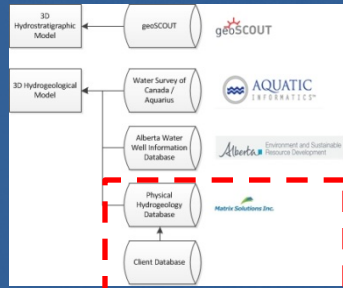
Predictions



DATABASE



MATRIX'S - PHYSICAL HYDROGEOLOGY DATABASE



Data

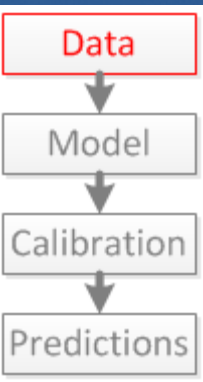
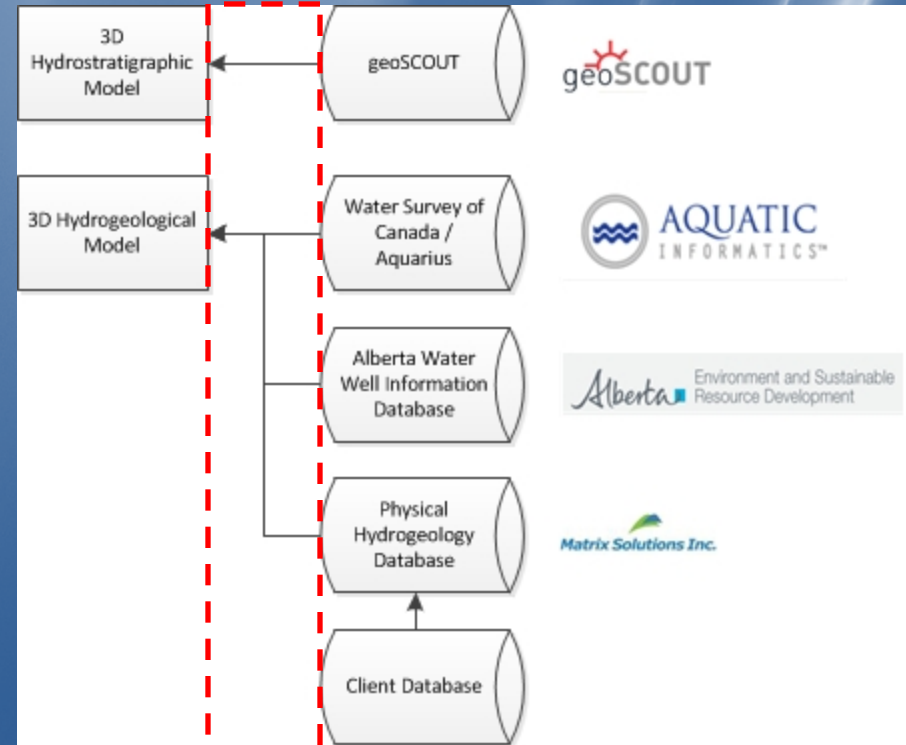
Model

Calibration

Predictions

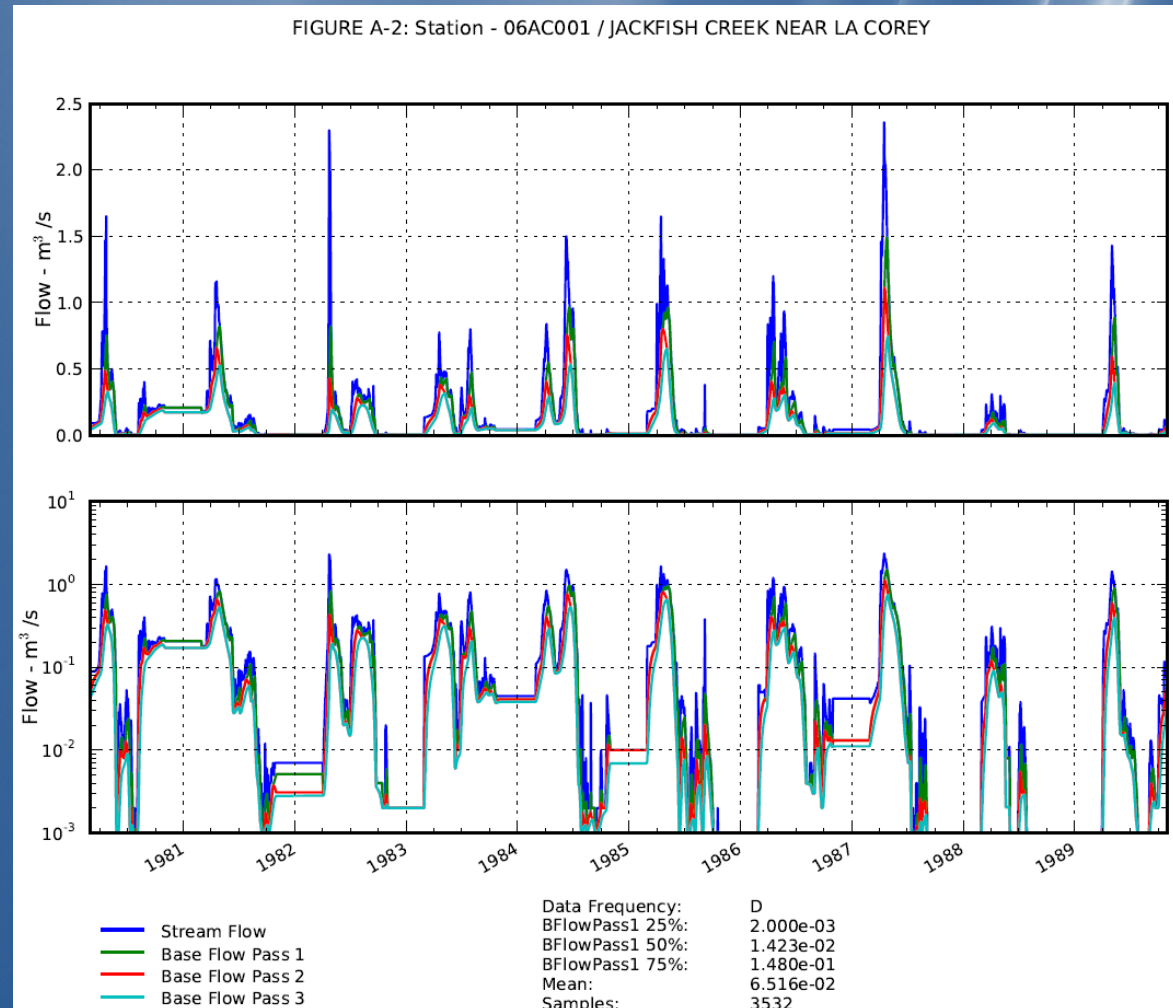
PYTHON SCRIPTS

- Used for:
 - Database query
 - Data QA/QC
 - Data filtering
 - Data Manipulation to Input/Output files



PYTHON SCRIPTS

- Used for:
 - Database query
 - Data QA/QC
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 - Data Manipulation to Input/Output files



Data



Model



Calibration

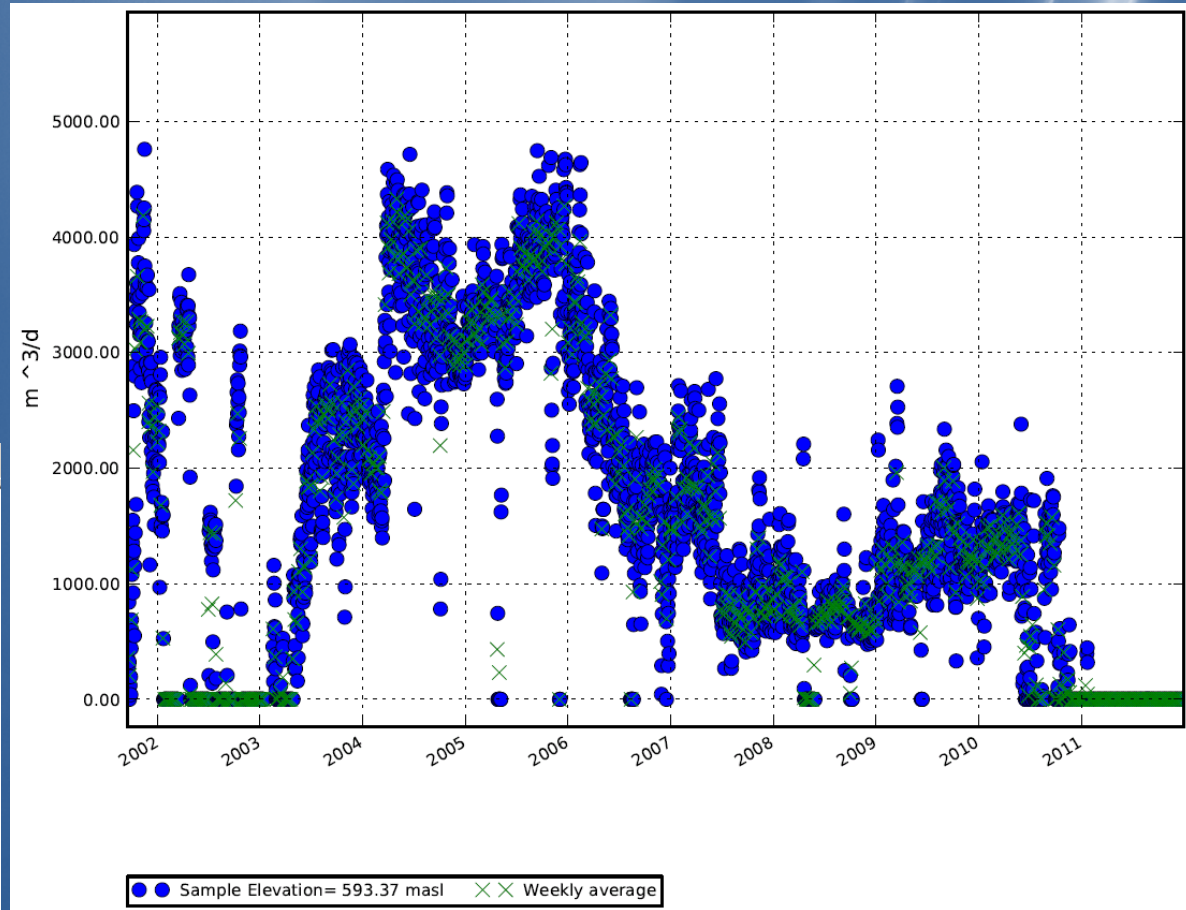


Predictions

PYTHON SCRIPTS

- Used for:
 - Database query
 - Data QA/QC
 - Data filtering
 - Data Manipulation to Input/Output files

PumpingRates.pow		
1	#1	
2	!Pumping Well1	
3	![type=Constant]	
4	0.00 0	
5	2450	354.0
6	2456	204.571428571
7	2463	688.0
8	2464	1123.5
9	2470	2155.92857143
10	2477	3028.17142857
11	2484	3658.84285714
12	2491	3287.4
13	2495	3088.76666667
14	2502	0.0
15	END	



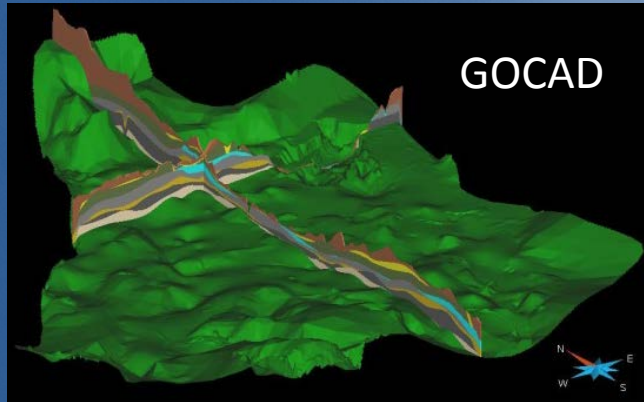
Data

Model

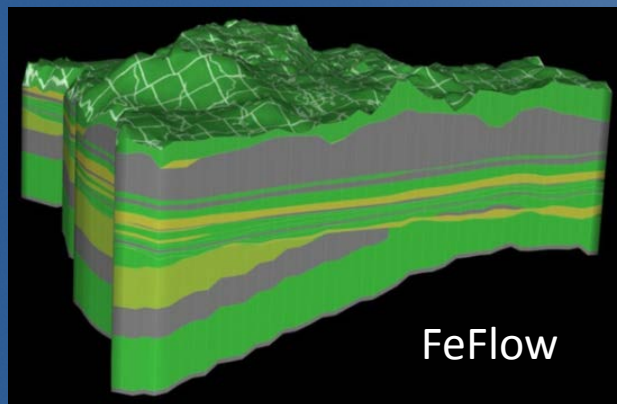
Calibration

Predictions

PYTHON SCRIPTS



Elevations_Corrected_FEFLOW.dat						
1	X	Y	Z	Slice		
2	570623.632812		6053689.51562	576.592102051	1	
3	570623.632812		6053689.51562	555.247802734	2	
4	570623.632812		6053689.51562	555.147802734	3	
5	570623.632812		6053689.51562	555.047802734	4	
6	570623.632812		6053689.51562	554.947802734	5	
7	570623.632812		6053689.51562	554.847802734	6	
8	570623.632812		6053689.51562	525.287719727	7	
9	570623.632812		6053689.51562	525.187719727	8	
10	570623.632812		6053689.51562	512.924682617	9	



Material_Properties.dat							
1	ELEM	LAYER	X	Y	THICK	Unit	
2	2145	1	564440.751668		5986655.60257	32.2664184567	4
3	35104	2	564440.751668		5986655.60257	0.1000000003	17
4	68063	3	564440.751668		5986655.60257	4.982051595	5
5	101022	4	564440.751668		5986655.60257	34.6912027993	6
6	133981	5	564440.751668		5986655.60257	0.1	6
7	166940	6	564440.751668		5986655.60257	63.011022949	10
8	199899	7	564440.751668		5986655.60257	0.1	10
9	232858	8	564440.751668		5986655.60257	24.55512085	8
10	265817	9	564440.751668		5986655.60257	4.976348877	11
11	298776	10	564440.751668		5986655.60257	10.4566853837	12

Data



Model



Calibration

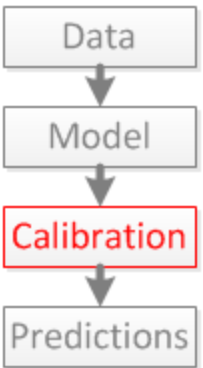
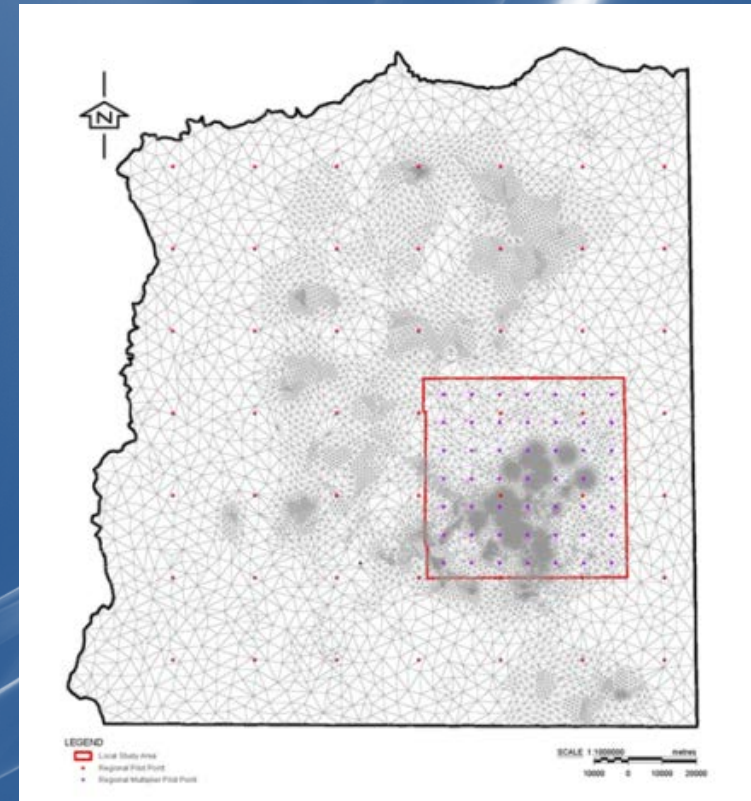
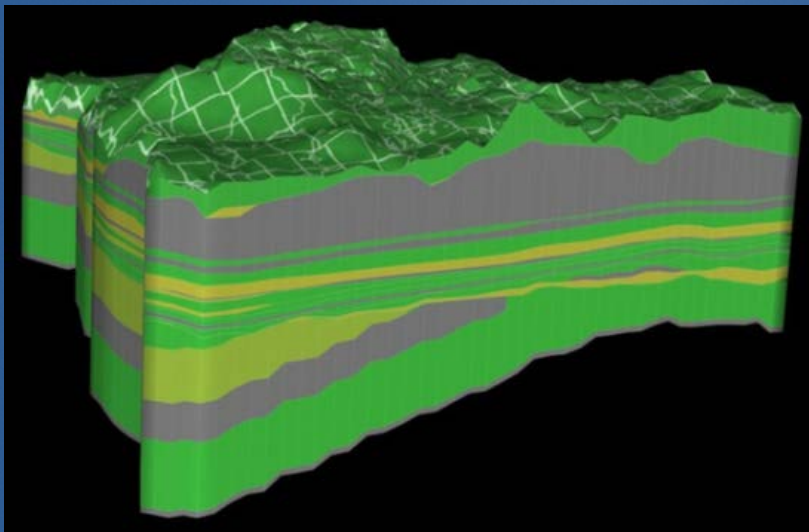
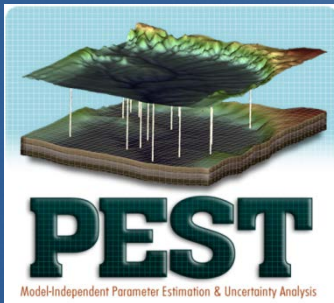


Predictions



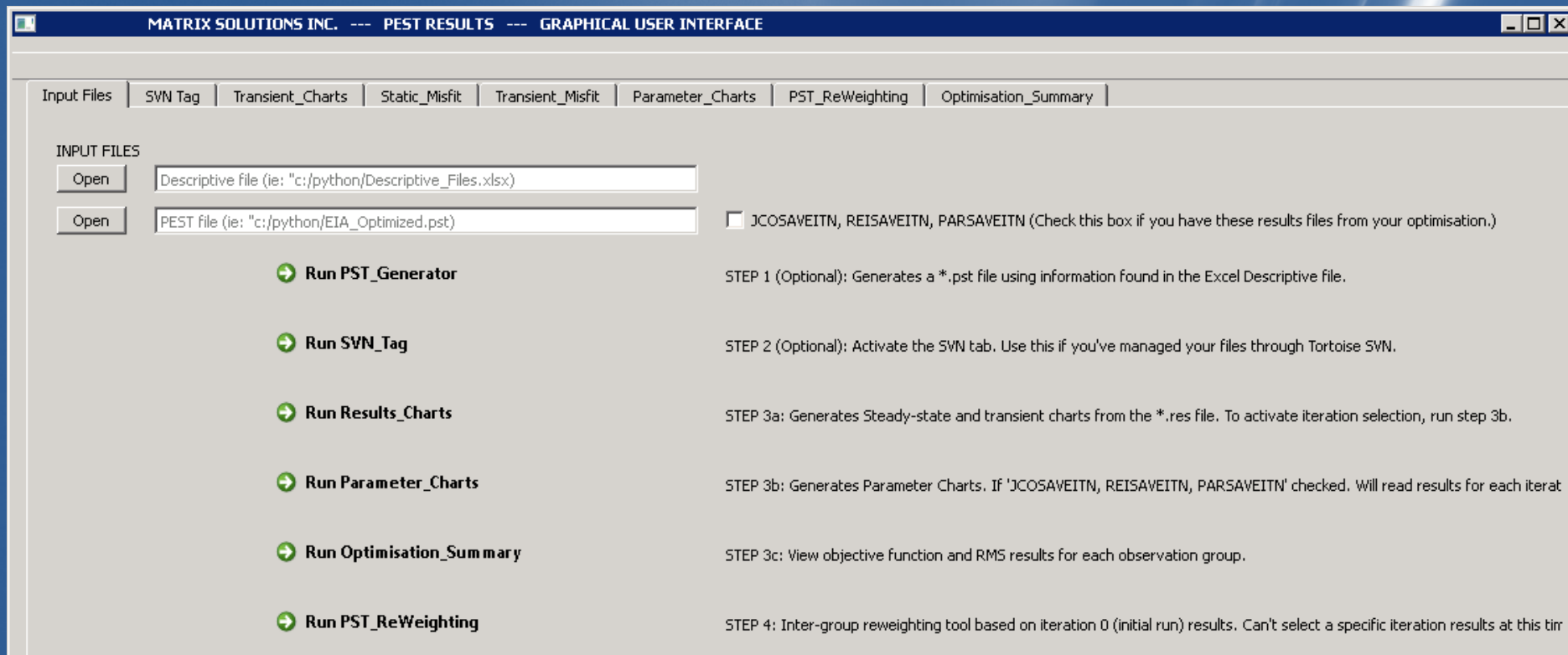
MATRIX'S PEST GUI

- PEST (Model Independent Parameter Estimation)



MATRIX'S PEST GUI

- Python / Qt
- Reads Descriptive File (Spatial + Temporal Information)
- Automated generation of PEST files



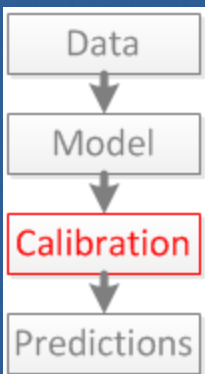
MATRIX'S PEST GUI

- Automated observation group/regularization reweighting
- Parameter visualization

Obs Group	Cur. Contribution Obj.Func.	Current % ▾	Multiplier Factor
h_aaaa	285208	22.5691	1
eswl	165634	13.107	1
baseflow	160577	12.7068	1
first_head	159534	12.6243	1
grad	130499	10.3267	1
h_aaab	122167	9.66733	1

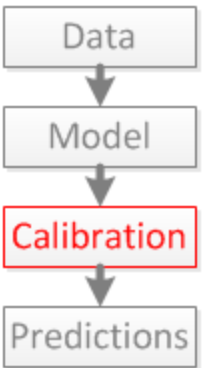
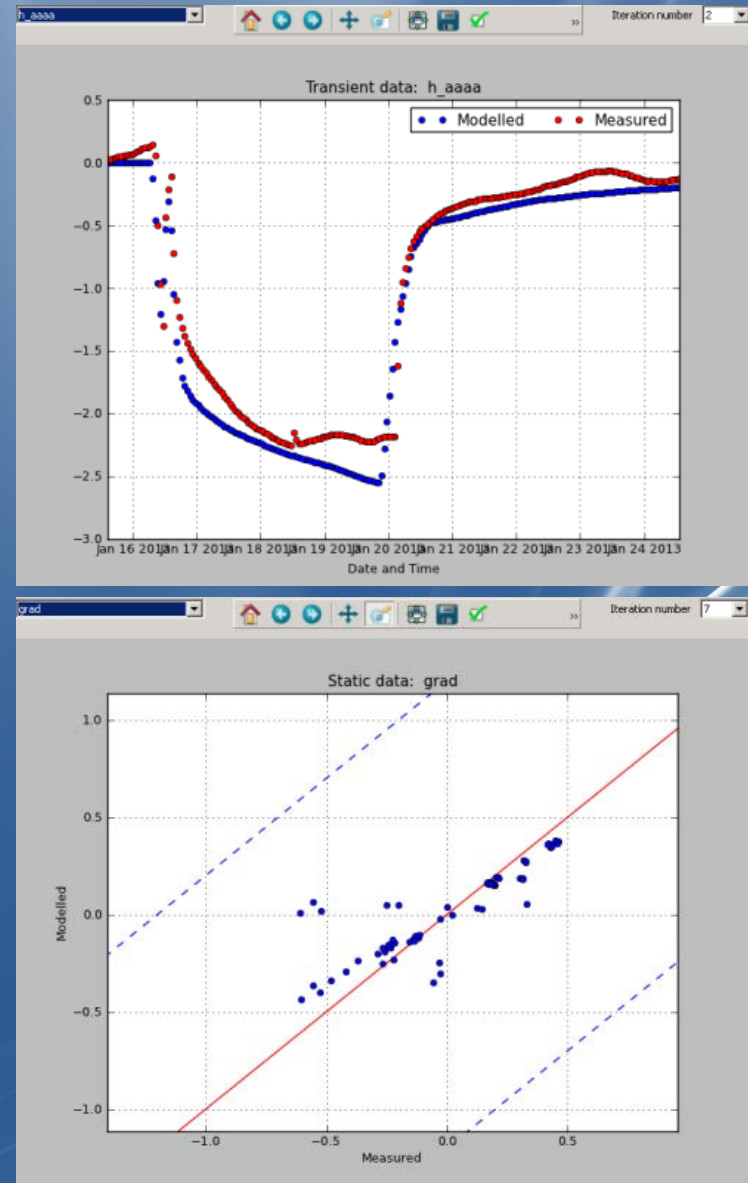
Regul Group	Cur. Contribution Obj.Func.	Current % ▾	Multiplier Factor
regul_pv	14.612	52.927	1
regul_aqt	8.8392	32.017	1
regul_aqf	3.9341	14.2499	1
regul_mlf	0.1319	0.477763	1
regul_ratio	0.0906191	0.328237	1

condxy	bf1skx;3.02e-05	bf1tkx;5.00e-08	bf2tkx;4.41e-08	blftkx;5.00e-08	e1skx;7.49e-05
	e2tkx;1.82e-08	e3skx;1.00e-06	elfskx;9.37e-05	etskx;1.00e-06	
	mcftkx;3.48e-08	mlflockx;7.05e-05	mlfskx;3.00e-04	rpgskx;2.42e-05	srfskx;4.22e-05
condz	bf1tkz;1.99e-10	bf2tkz;8.27e-10	blftkz;5.00e-09	e2tkz;1.00e-11	
	mcftkz;7.61e-10				
ratio	ratios;5.00e+00				



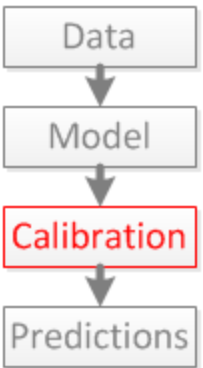
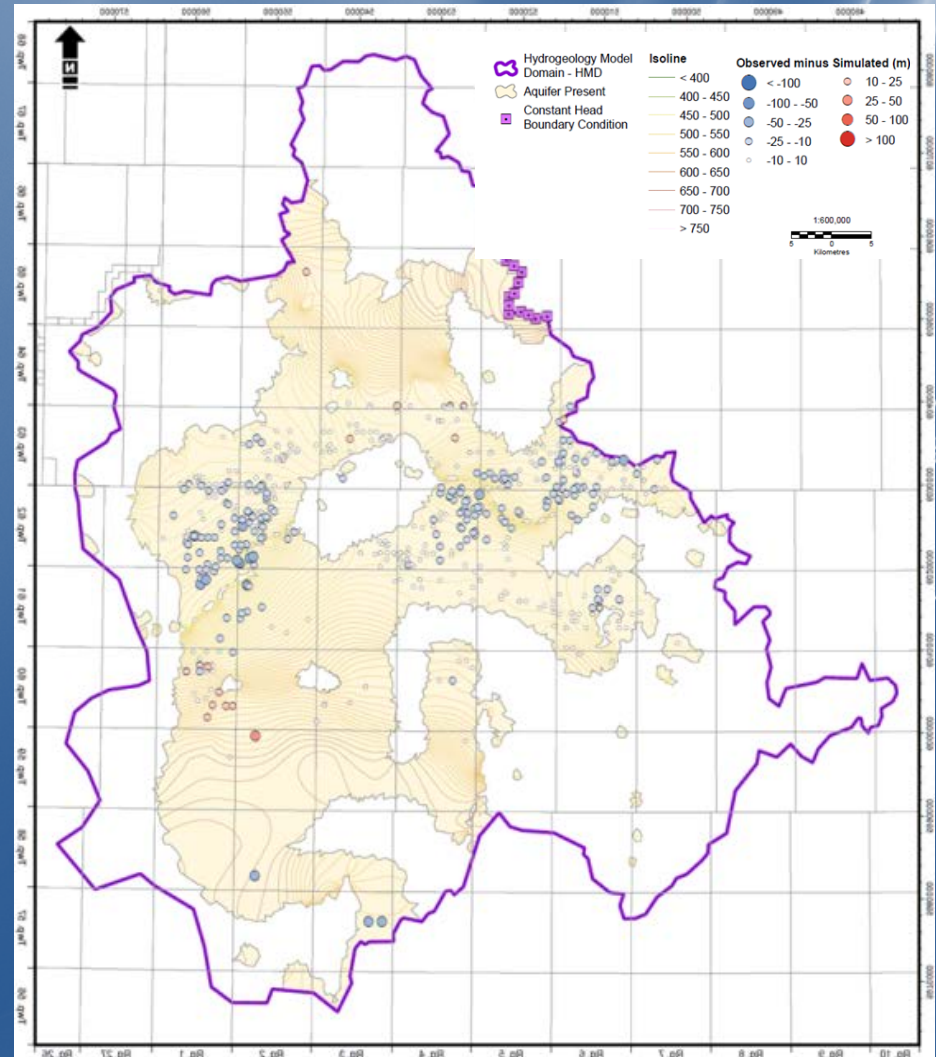
MATRIX'S PEST GUI

- Visualization of data misfit
- Residuals statistics



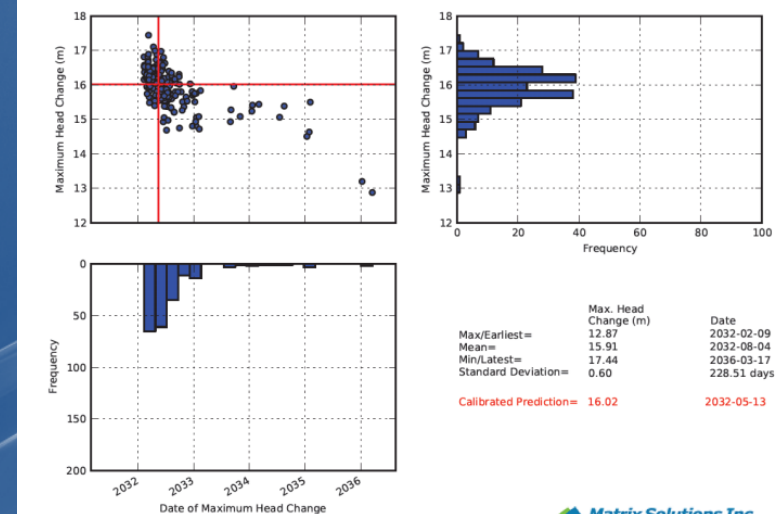
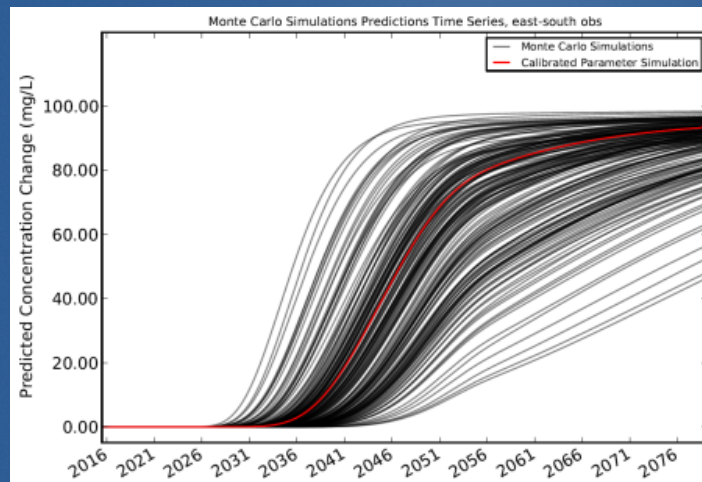
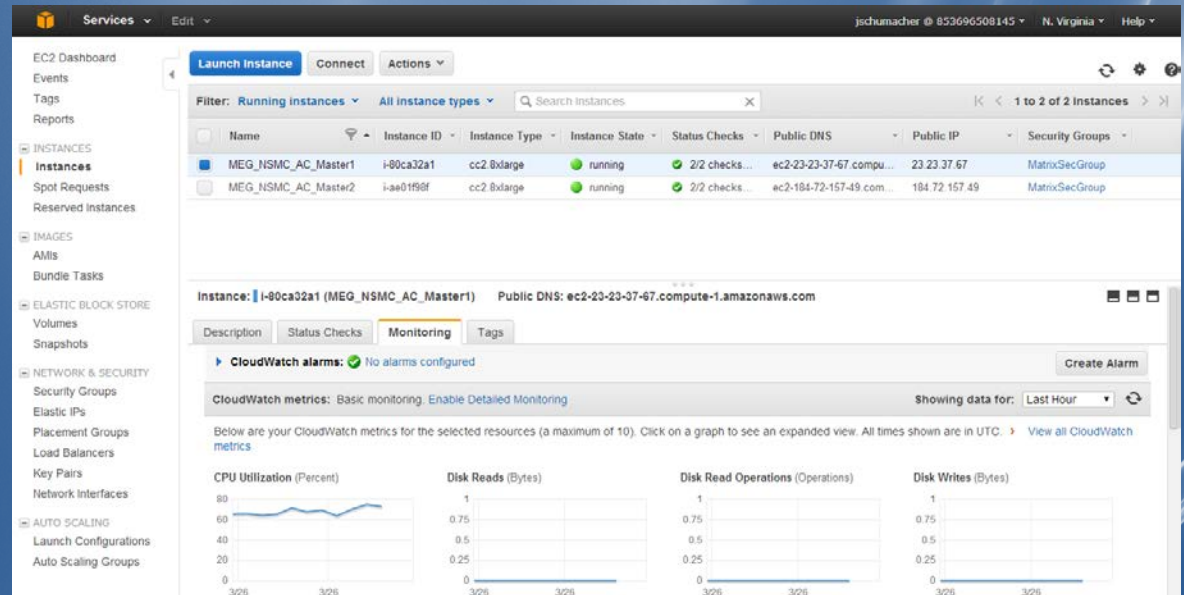
MATRIX'S PEST GUI

- Plugin for Quantum GIS
- Shapefiles automatically generated



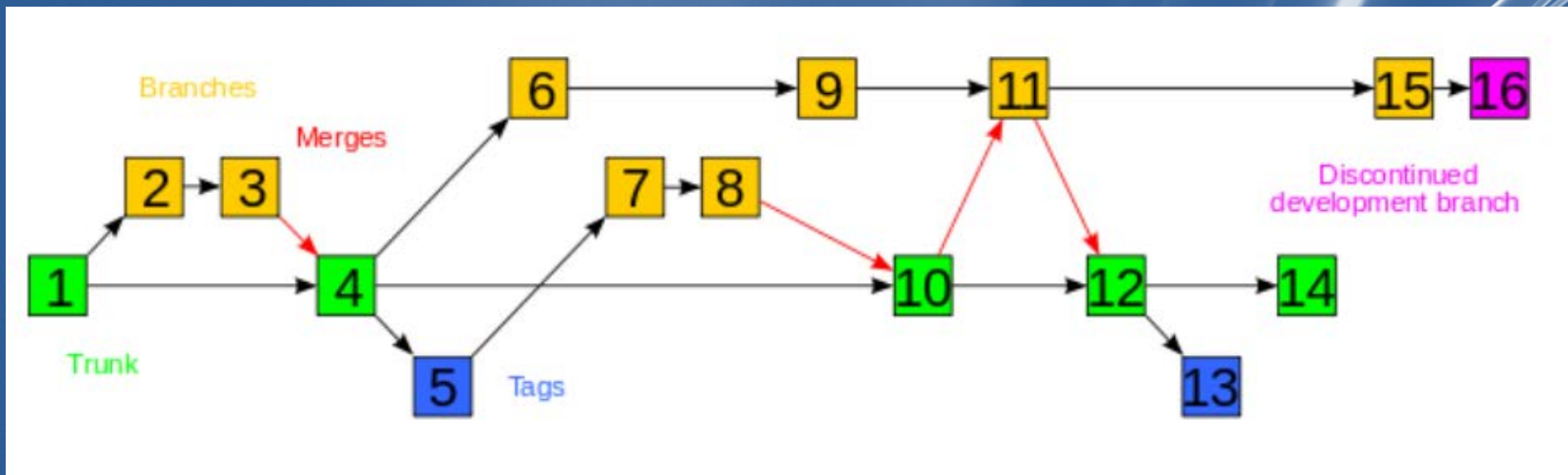
CLOUD COMPUTING

- Amazon EC2 server
 - Solution for higher CPU
 - PEST Optimization
 - Null-Space Monte Carlo Uncertainty Analysis



VERSION CONTROL SYSTEM

- Repository with binary Incremental changes
- Keep log of changes and versions
- Extremely useful for collaborative work and script development/deployment/testing (TDD)



Data

Model

Calibration

Predictions



SUMMARY

- Data intensive groundwater assessment becoming the norm
- Multiple challenges
- Database development and python scripting has allowed for efficient data management and QA/QC
- Linking PEST files to Python visualization, GIS, and a QT GUI has helped in making subjective weighting and regularization choices when calibrating highly parameterized models with PEST
- Version control provides a efficient workflow management and tracking to allow efficient collaboration and repeatability.



QUESTIONS

