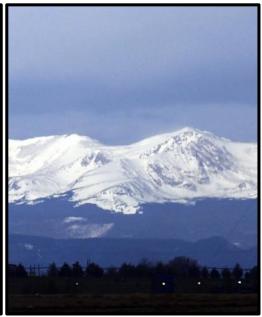
Mining Oil and Gas Well Integrity Data in Colorado and New Mexico











Greg Lackey

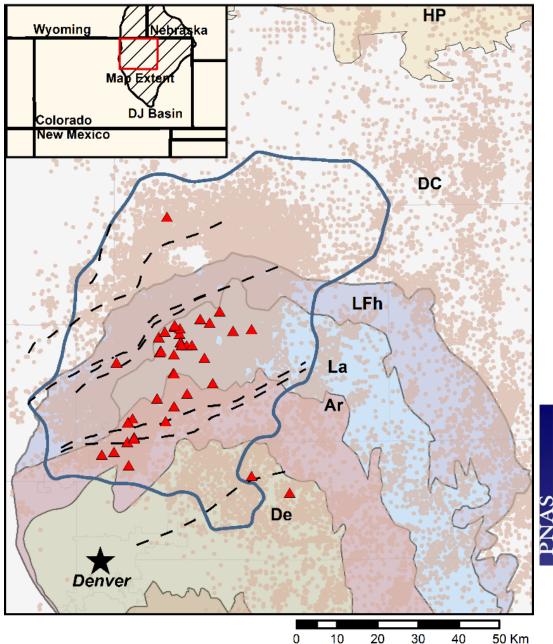
<u>Gregory.Lackey@Colorado.edu</u>

5/18/2018



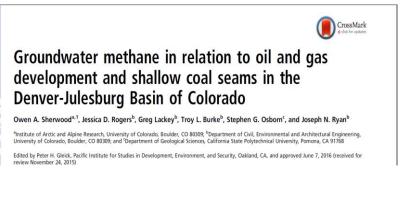


Wattenberg Field

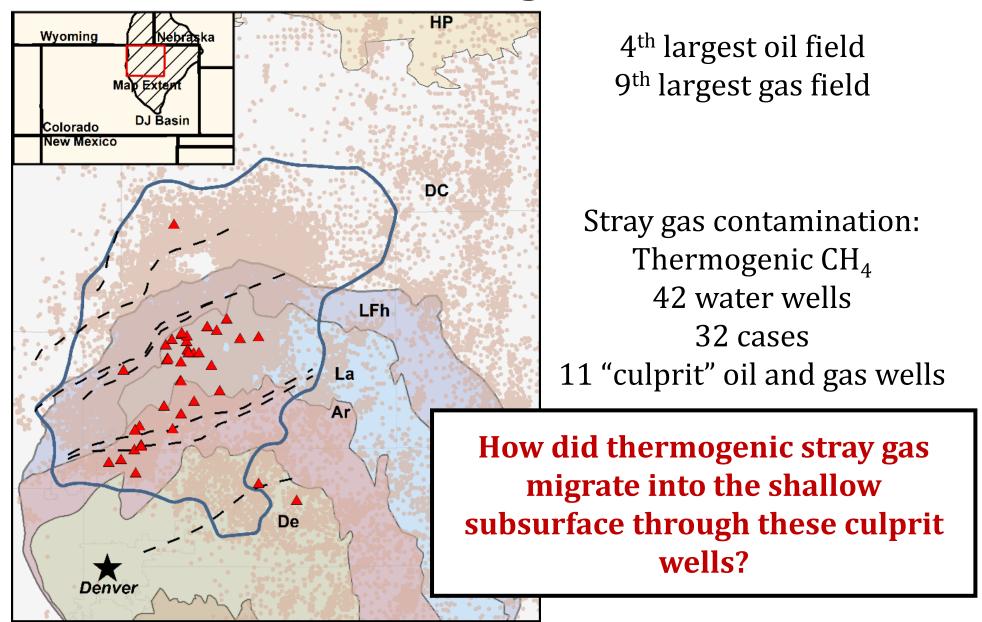


4th largest oil field 9th largest gas field

Stray gas contamination:
Thermogenic CH₄
42 water wells
32 cases
11 "culprit" oil and gas wells



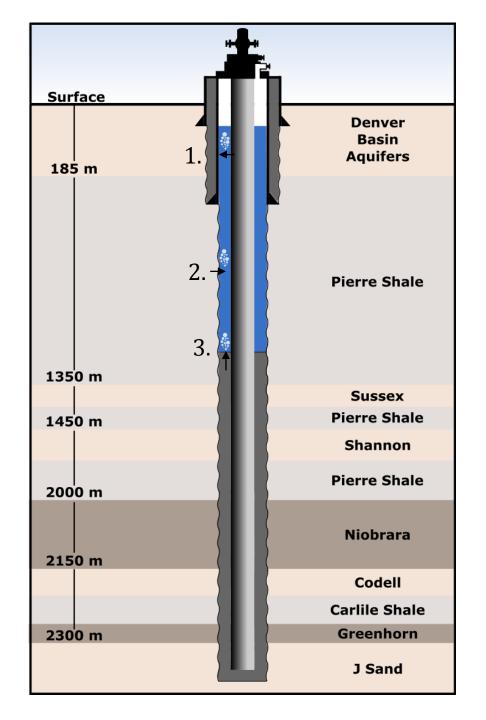
Wattenberg Field

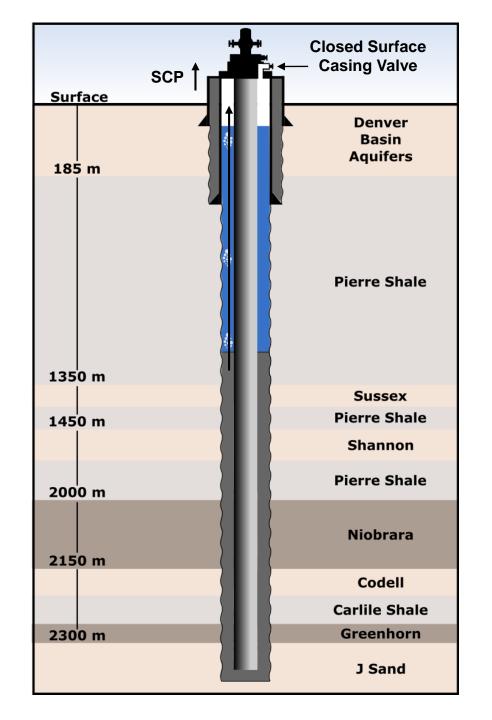


50 Km

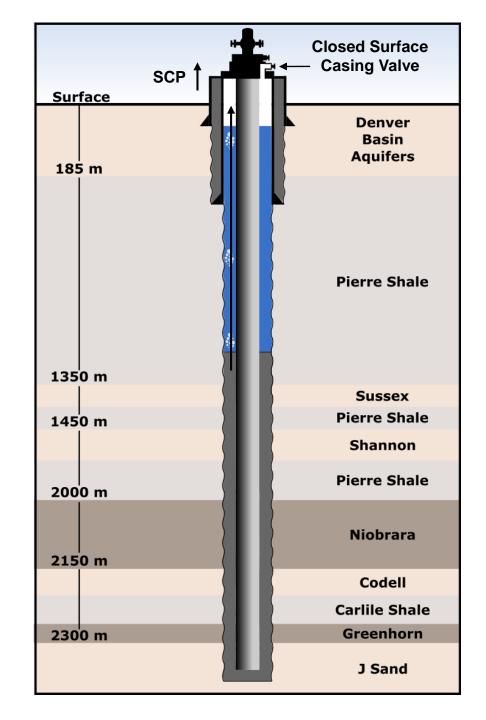
Well Leakage

- 1. Casing leak
- 2. Unknown intermediate
- 3. Faulty cement seal or improper cement coverage



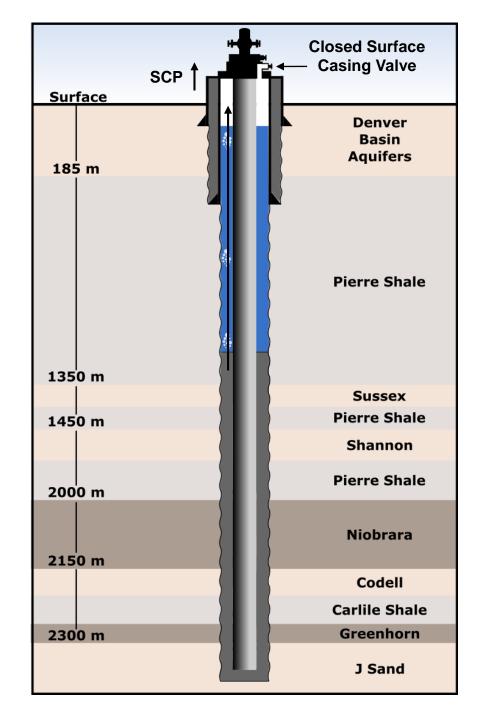


Sustained annular pressure (SAP), bradenhead pressure, surface casing vent flow (SCVF)



Sustained annular pressure (SAP), bradenhead pressure, surface casing vent flow (SCVF)

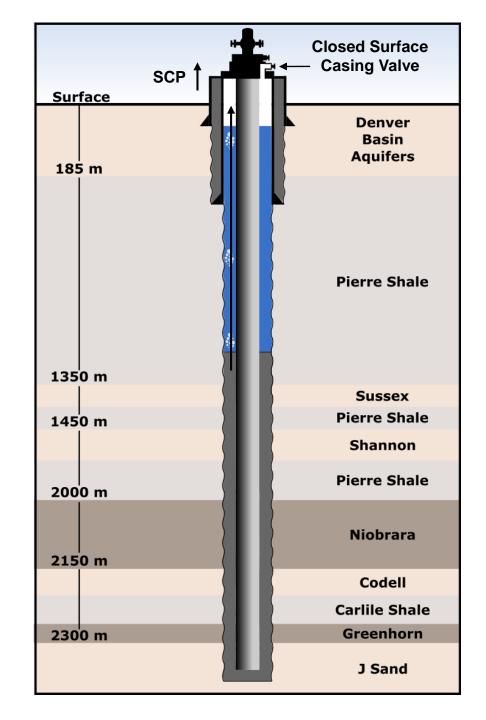
Should be no SCP in a properly functioning well

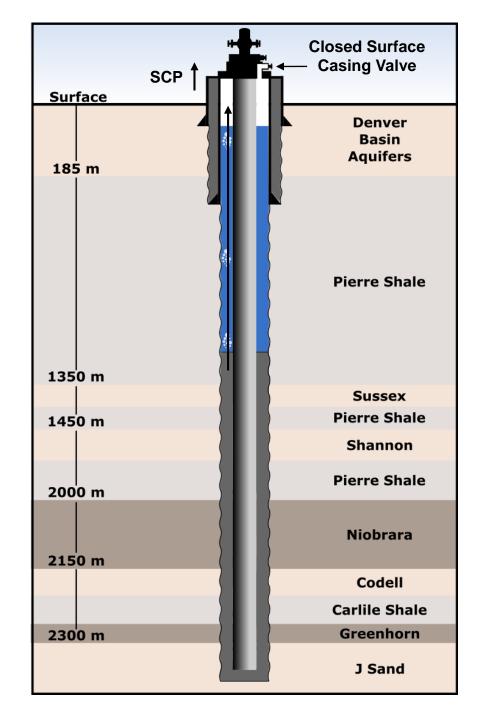


Sustained annular pressure (SAP), bradenhead pressure, surface casing vent flow (SCVF)

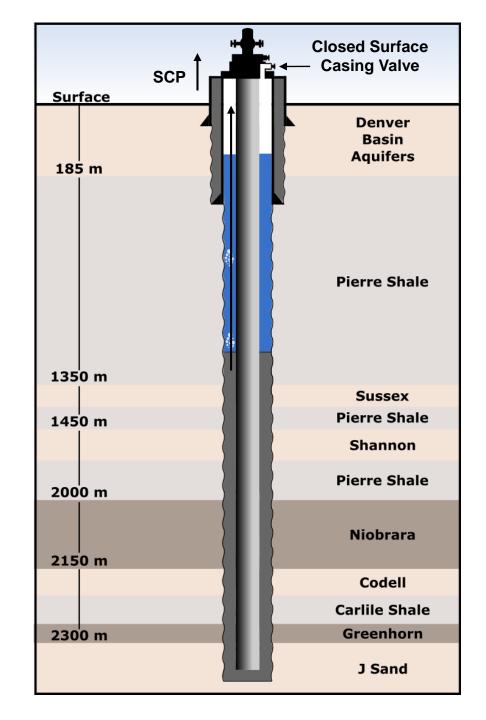
Should be no SCP in a properly functioning well

Sustained casing pressure is an easily measured gauge of well integrity, but is poorly documented

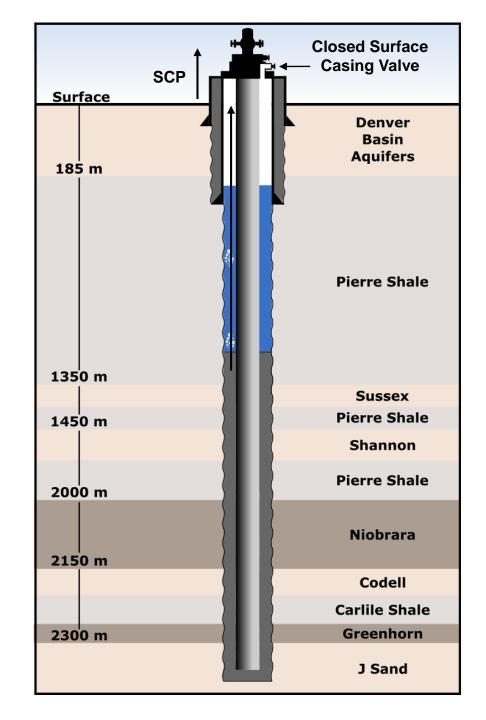




As pressure builds annular liquid is displaced

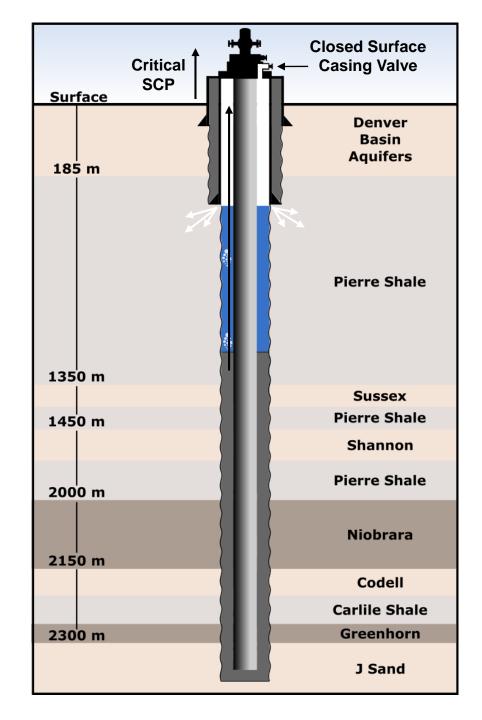


As pressure builds annular liquid is displaced



As pressure builds annular liquid is displaced

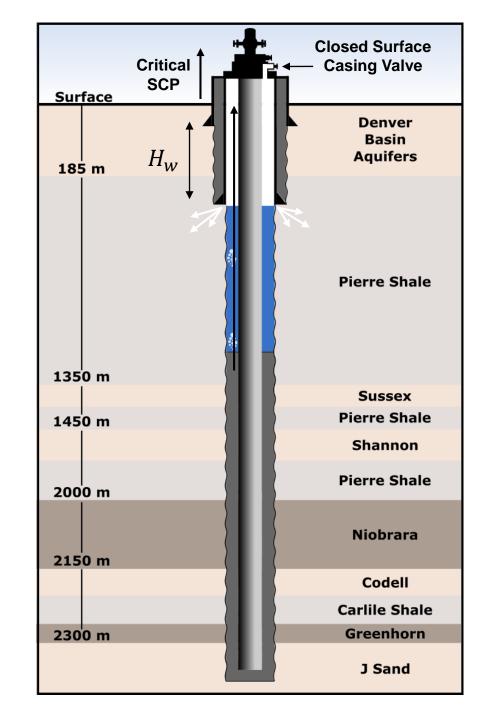
When SCP = formation fluid pressure at bottom of surface casing stray gas migration can be induced



As pressure builds annular liquid is displaced

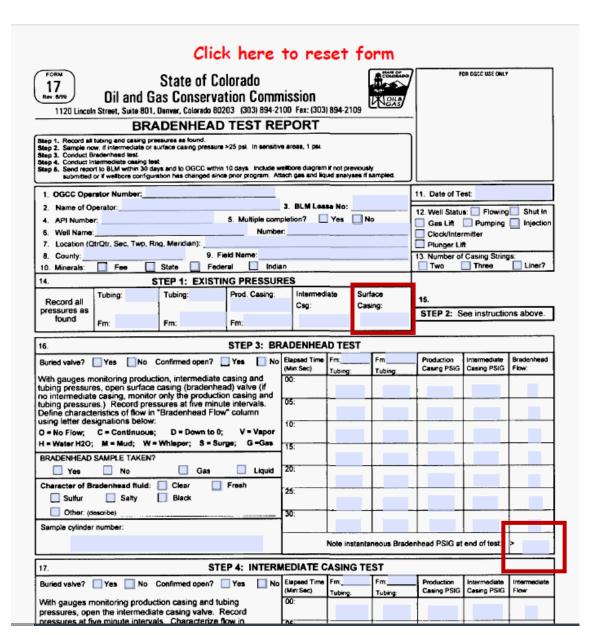
When SCP = formation fluid pressure at bottom of surface casing stray gas migration can be induced

Critical sustained casing pressure is a well-specific physically meaningful indicator of stray gas migration

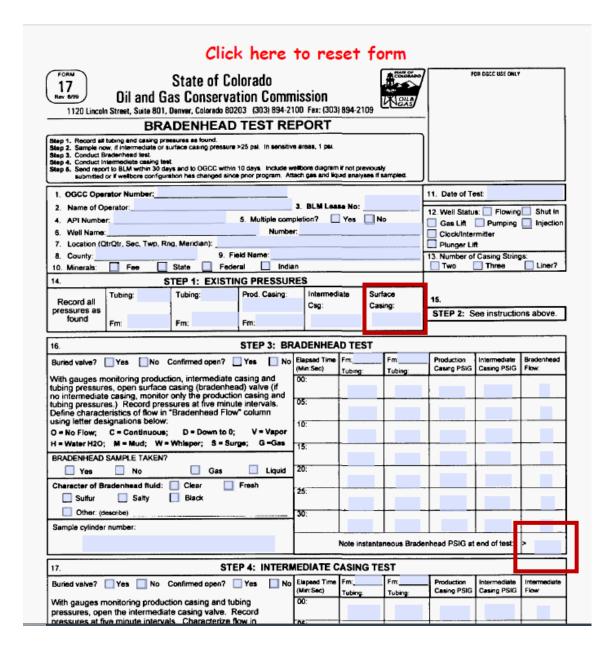


Step 1. Record at Step 2. Sample no Step 3. Conduct 8	n Street, Suite 801, BRA tubing and casing priow, if intermediate or in recombinated tests the mediate casing termediate casing termediate.	as Conserv Denver, Colorado ADENHEA Hestures as found. Hurface casing press	Colorado Vation Comm 80203 (303) 894-21 D TEST RE Lure >25 pal. In sensitiv	00 Fex: (303 PORT			-	OR OGCC WSE CHLY	
submitted	rt to BLM within 30 de or if wellbore configur rator Number:	eys and to OGCC wit ration has changed a	thin 10 days. Include w since prior program. Att	elibore diagram ach gas and liq	if not pre uid analy:	wousty see if samples.	11. Date of Te	est	
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10. Minerals:	Fee		Field Name:India	ın			Two	Three	Liner?
Record all pressures as found	Tubing:	Tubing:	Prod. Casing: Fm:	Intermed Cag:	iate	Surface Casing:	15. STEP 2: See instructions above.		
16.			STEP 3: BR	ADENHEA	D TES	ST .			
tubing pressur no intermediate tubing pressur Define charact using letter des O = No Flow;	Yes No nonitoring produces, open surface e casing, monitor es.) Record preseristics of flow in signations below. C = Continuous; M = Mud; W =	casing (braden ronly the productionsures at five mi "Bradenhead F D = Down to	te casing and head) valve (if ction casing and nute intervals. low* column	Elapsed Time (Min:Sec) 00: 05: 10:	Fm: Tubing:	FmTubing:	Production Casing PSiG	Intermeduate Casing PSIG	Bradenhead Flow:
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17.		S	TEP 4: INTERN	MEDIATE C	ASIN	3 TEST			

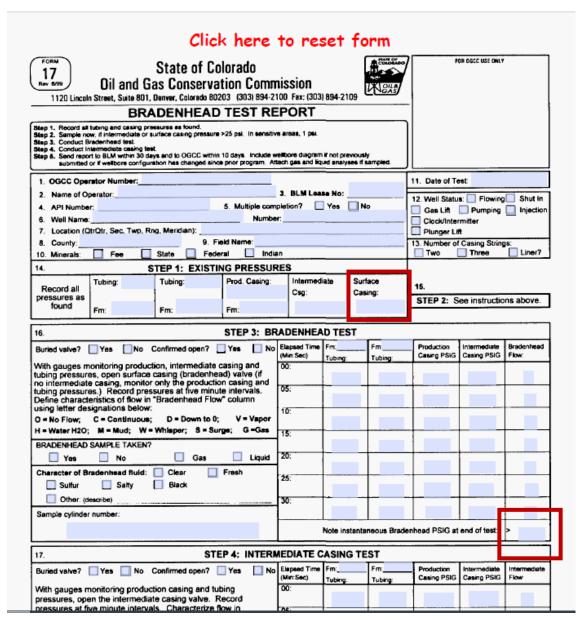
Pressure measured as found on surface casing



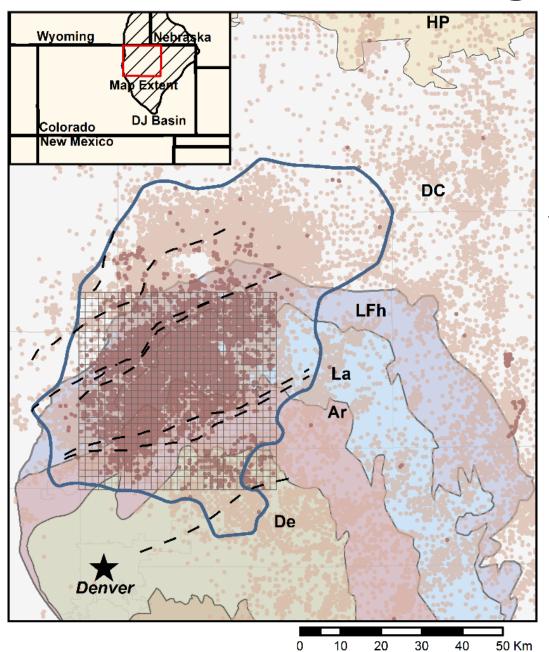
- Pressure measured as found on surface casing
- Instantaneous pressure measured at the end of the test



- Pressure measured as found on surface casing
- Instantaneous pressure measured at the end of the test
- Filed as text-based PDFs that can be mined using Python

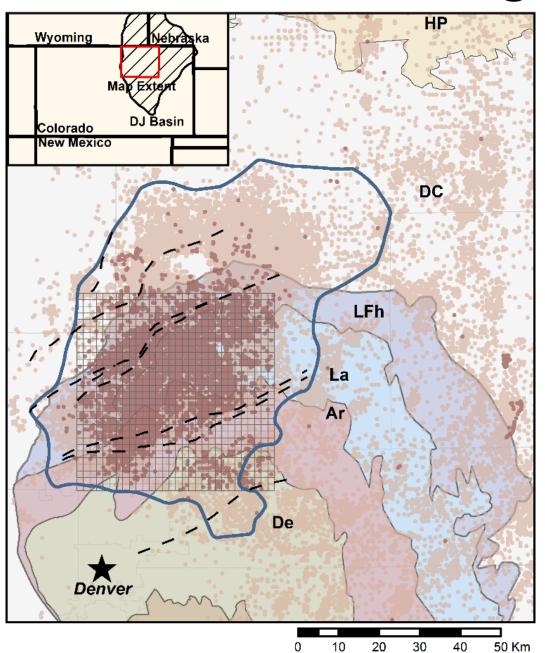


First Well Integrity Study



2010 bradenhead testing policy establishes Wattenberg Test Zone (WTZ)

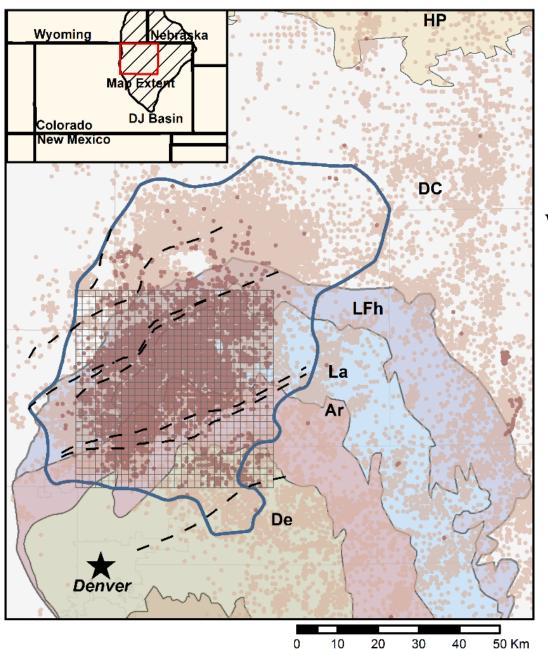
First Well Integrity Study



2010 bradenhead testing policy establishes Wattenberg Test Zone (WTZ)

3,923 readable bradenhead tests (after QA/QC)

First Well Integrity Study

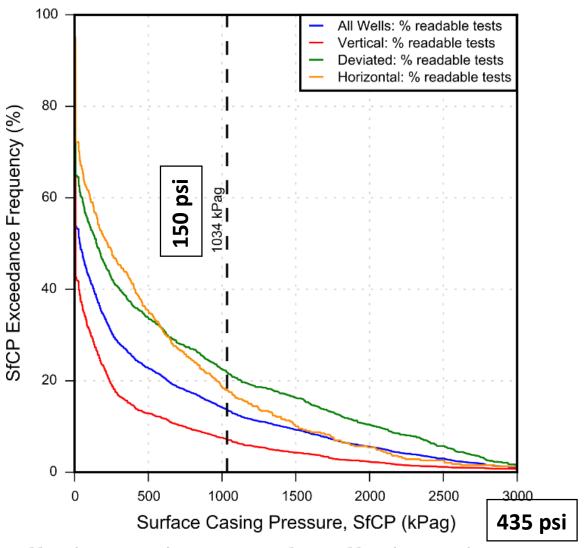


2010 bradenhead testing policy establishes Wattenberg Test Zone (WTZ)

3,923 readable bradenhead tests (after QA/QC)

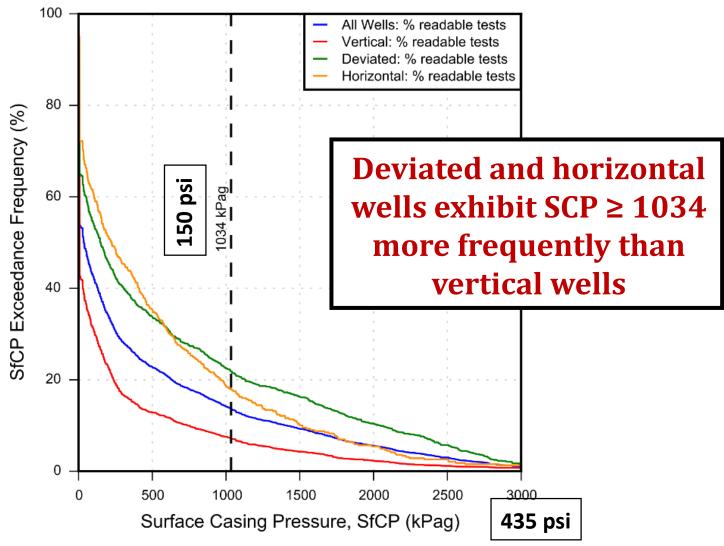
Paired with QA/QC well construction data

How Many Wells Have SCP?

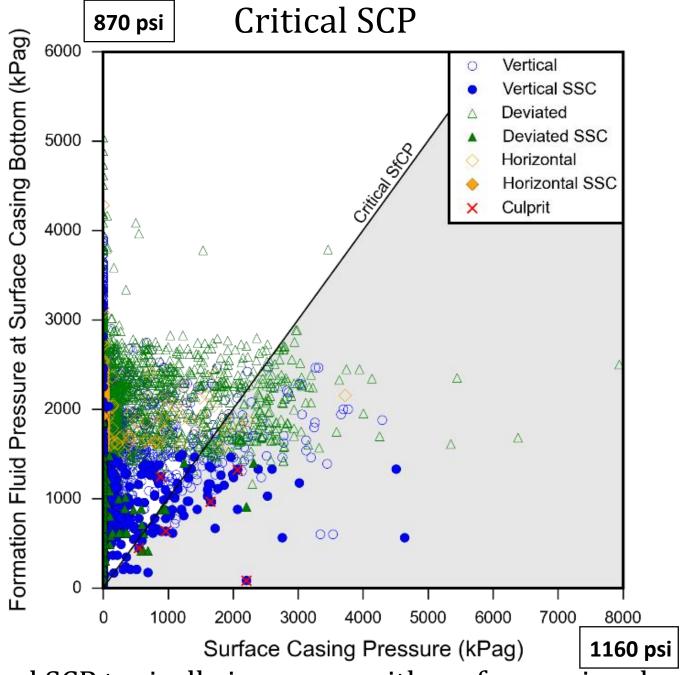


All Wells (13.8%), Vertical Wells (7.4%), Deviated Wells (21.9%), and Horizontal Wells (18%)

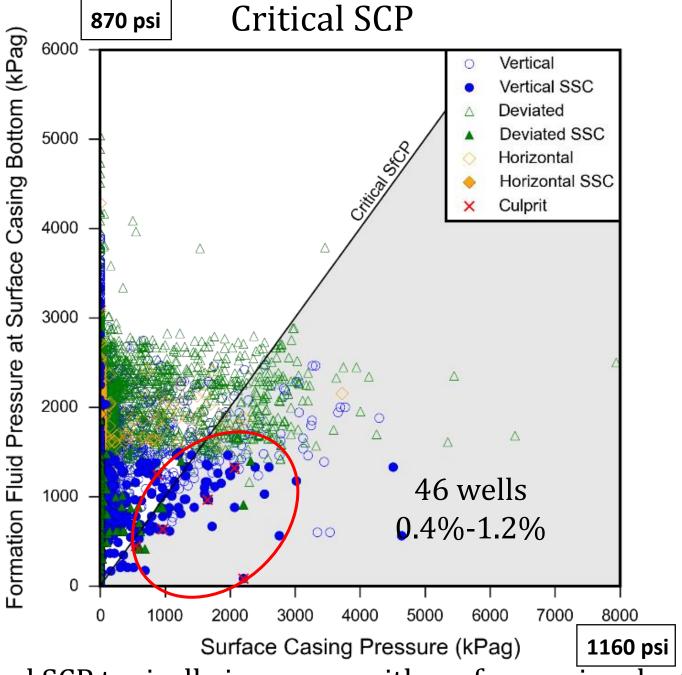
How Many Wells Have SCP?



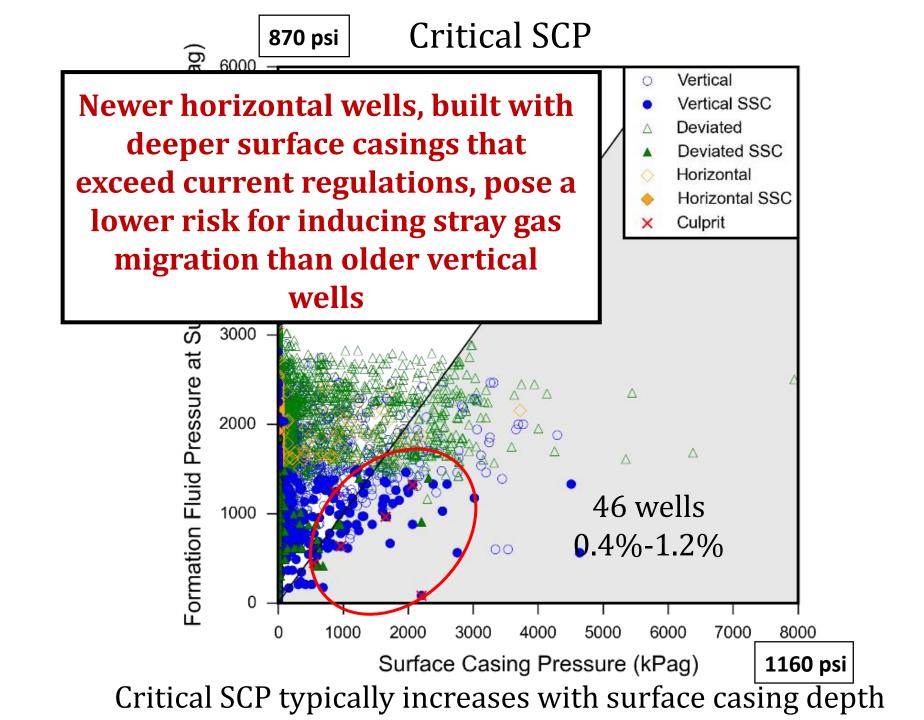
All Wells (13.8%), Vertical Wells (7.4%), Deviated Wells (21.9%), and Horizontal Wells (18%)



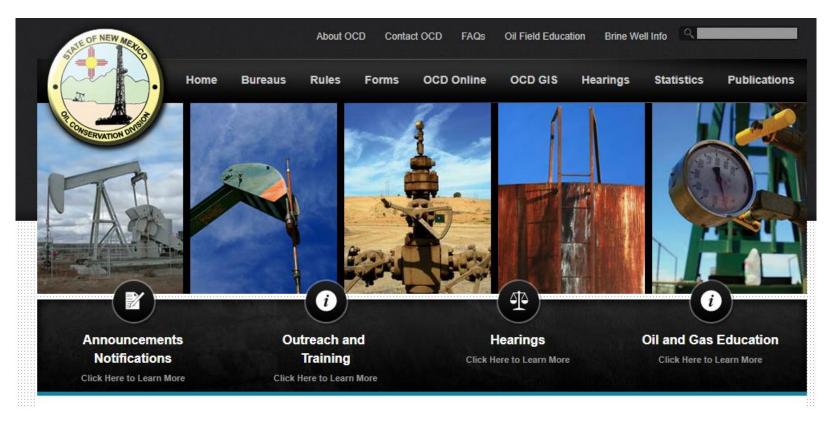
Critical SCP typically increases with surface casing depth



Critical SCP typically increases with surface casing depth

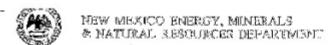


New Mexico



http://www.emnrd.state.nm.us/ocd/)

New Mexico



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New Mexico Challenges

NEW MEXICO ENERGY, MINERALS S. NATURAL SESCURCES DEPARTMENT. S. NATURAL SESCURCES DEPARTMENT. S. STATE OF THE PART OF THE P	NEW MEXICO ENERGY, MINERALS & NATURAL RESOURCES DEPARTMENT OR, CONSERVATION DIVISION ACTIO OR STORE SHALL BE 4-517 4-762, (100) 134-4175 OIL COMS. DIV DIST. 3 OCT 0 8 2015
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If brudeahead lowed water, check all of the descriptions that apply below:	CLEAR FRESH SALTY SULFURBLACK
CLEAR FREISH SALLY SALLY BALLY BEACK 5 MINUTE SALLY BRADENHEAD INTERMIGNATE	REMARKS: Vollung When opened. Nothing when opened. Nothing when opened. By Delbas Dee / BP Witness Volume Guelling (Position) E-mail address.

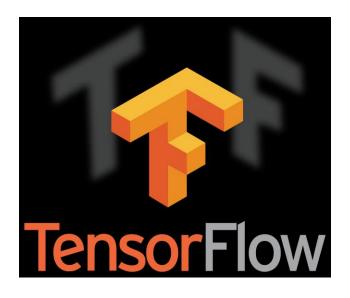
2.25 million documents labeled only by API# and all are scanned images (\sim 600,000 of interest)

New Mexico Challenges

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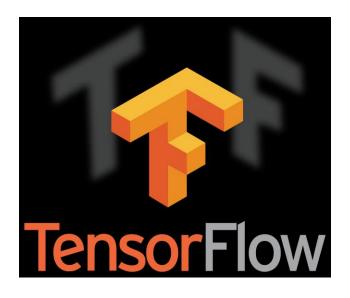
2.25 million documents labeled only by API# and all are scanned images (\sim 600,000 of interest)

TensorFlow



Open source machine learning framework developed by Google

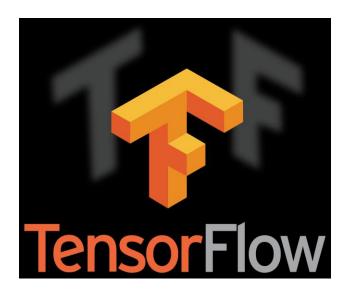
TensorFlow



Open source machine learning framework developed by Google

Can be used for broad range of machine learning tasks but was developed for deep neural network modeling

TensorFlow



Open source machine learning framework developed by Google

Can be used for broad range of machine learning tasks but was developed for deep neural network modeling

Commonly used for categorization tasks

Roughly How it Works

"MobileNet" convolutional neural network

https://arxiv.org/pdf/1704.04861.pdf

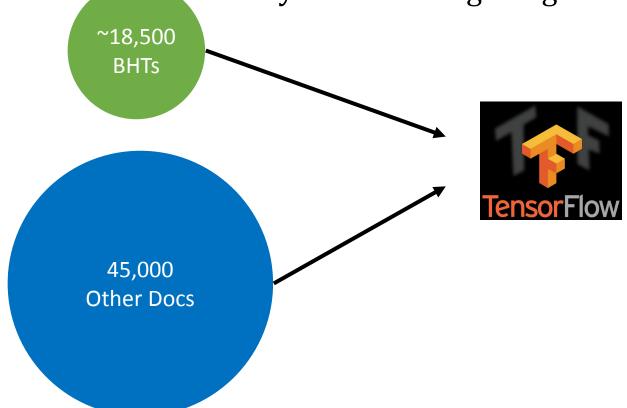
Already trained using ImageNet (>14 million images)

Roughly How it Works

"MobileNet" convolutional neural network

https://arxiv.org/pdf/1704.04861.pdf

Already trained using ImageNet (>14 million images)



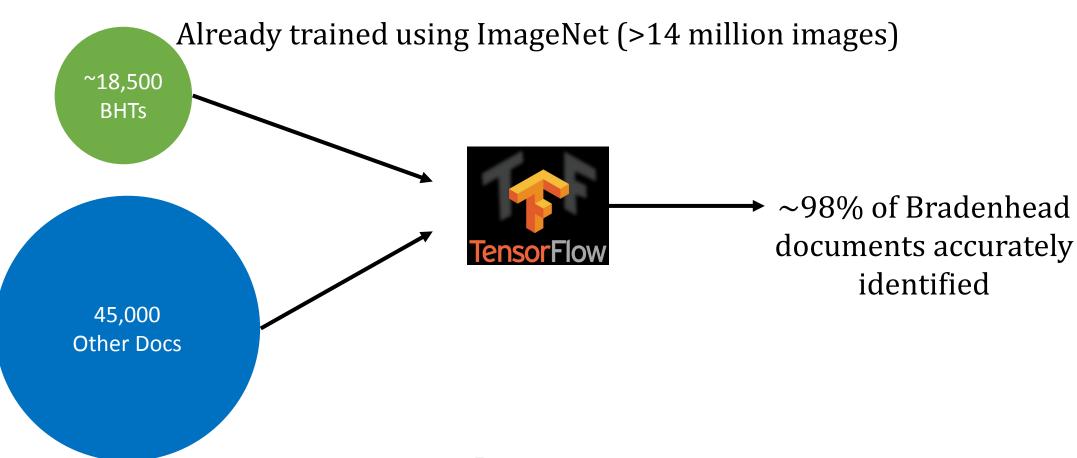
Retraining

(https://codelabs.developers.google.com/codelabs/tensorflow-for-poets/#)

Roughly How it Works

"MobileNet" convolutional neural network

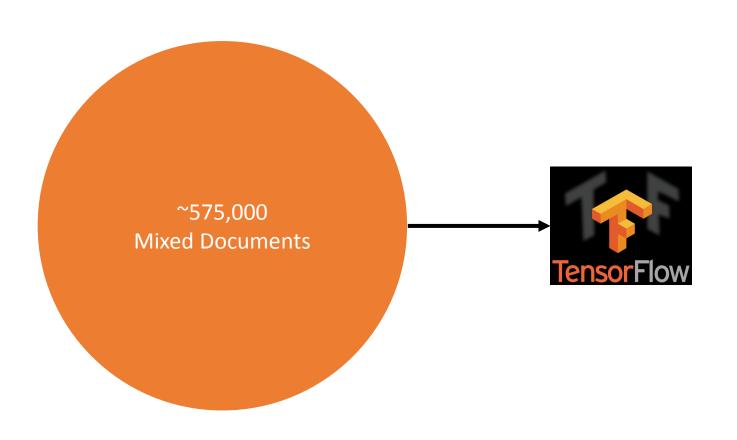
https://arxiv.org/pdf/1704.04861.pdf



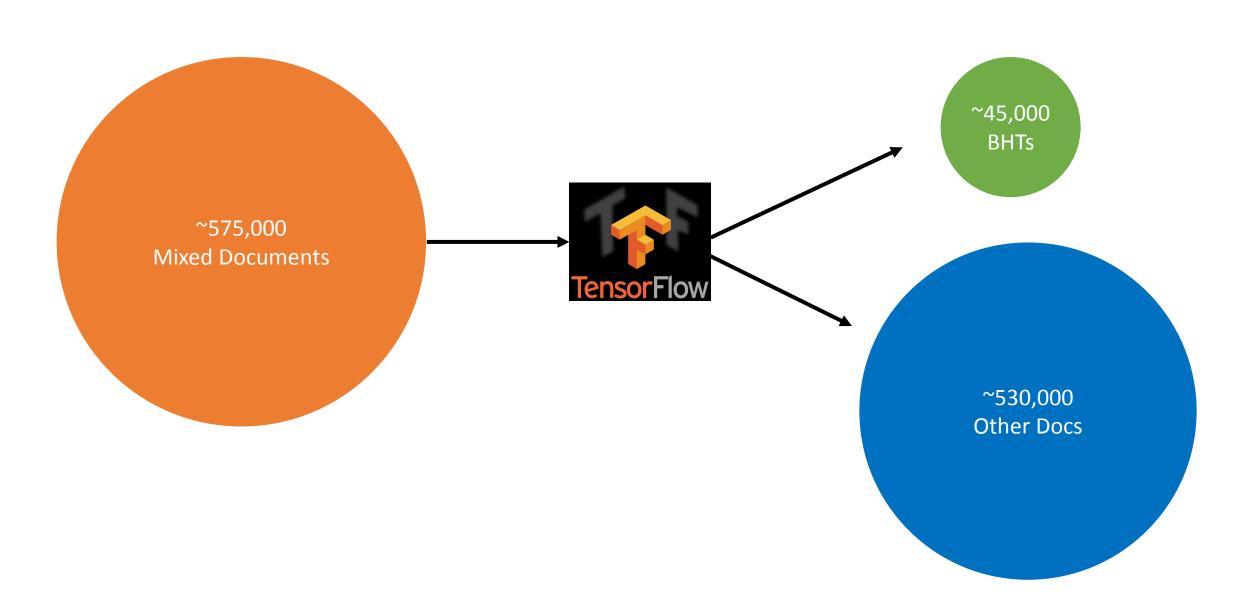
Retraining

(https://codelabs.developers.google.com/codelabs/tensorflow-for-poets/#)

Document Sorting



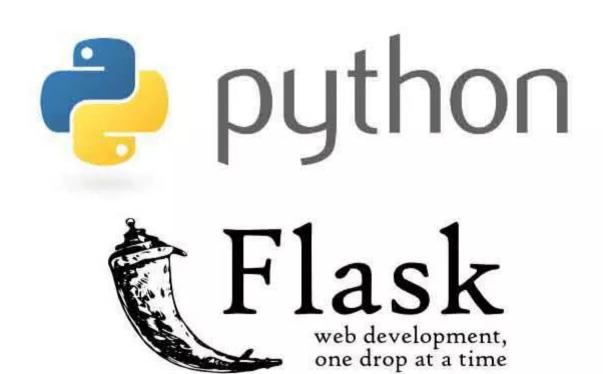
Document Sorting



New Mexico Challenges

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2.25 million documents labeled only by API# and all are scanned images (\sim 600,000 of interest)



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Please log in to a	access this page.	
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Hi, greg!

You have scraped 221 documents.

A total of 6191 documents have been scraped thus far.

There are 39210 documents left to be scraped.

Begin Scraping

Score Board



valerie_c: 173



steven_w: 108



marcus_k: 44



benjamin_w: 60



devansh: 713

Visual Scraper Home Profile Logout Scraper 3004534135_9_wf.jpg Successfully Submitted! NEW MIKKICO ENERGY, MINERALS Off, Consequence, Unifical Agency of State (Unifical Costs of Consequence Agency of State (Consequence (USA 200 SET) Files (Consequence Consequence — Adentificate of Unifical Consequence — Adentificate **Entry Data** & NATURAL RESQUECES DEPARTMENT Go Back Test Date (e.g. YYYY-MM-DD) BRADENHEAD TEST REPORT 2011-06-28 Date of Test 6-22-1 Operator MACO + WILLIS API +30-0.45 - 23745. Initial Bradenhead Pressure Property Name 26 of Cont Well No. 348 Locations Unit_Section 36 Township 32 Range 12 Well Steller(Shor-In or Producing) Initial PSI: Tabing 45 Intermediate 11 Casing 48 Bradenhead 435 OPEN BRADENHEAD AND INTERMEDIATE TO ATMOSPHERE INDIVIDUALLY FOR 15 MINUTES EACH Initial Intermediate 1 Pressure PRESSURE FLOW CHARACTERISTICS Testing Bradenhead INTERM BRADENBURAD INTERMIDIATE TIME 5 min Initial Intermediate 2 Pressure 10 min Surges 143 Down to Nothing Nothing Initial Casing Pressure 25 mão Cras & Water Water **Initial Tubing Pressure** If brudenhead flowed water, check all of the descriptions that apply below: BRADENHEAD O 5 MINUTE SOCT-IN PRESSURE Final Bradenhead Pressure Final Intermediate 1 Pressure **Final Casing Pressure** Bradenhead Buildup Pressure

Intermediate 1 Buildup Pressure

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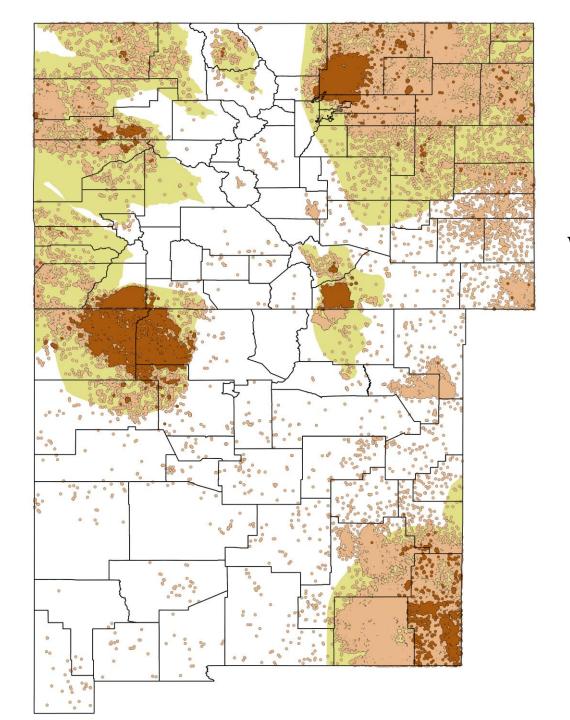
Website accessible from anywhere

Multiple scrapers can work at the same time

~15 seconds a document

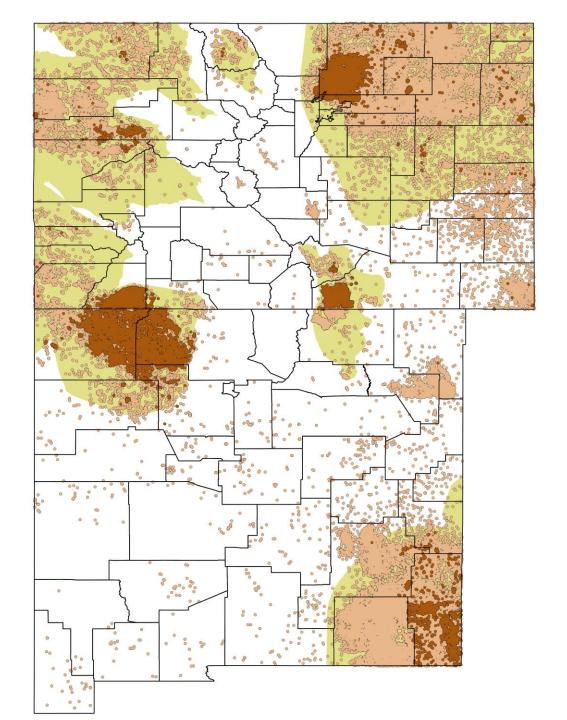
190 hours of work

Well construction records for 232,645 wells in Colorado (114,843) and New Mexico (117,802).



Well construction records for 232,645 wells in Colorado (114,843) and New Mexico (117,802).

Well integrity test records for 34,727 wells. 19,540 in Colorado and 15,187 in New Mexico.



Well construction records for 232,645 wells in Colorado (114,843) and New Mexico (117,802).

Well integrity test records for 34,727 wells. 19,540 in Colorado and 15,187 in New Mexico.

After release of PA DEP well integrity data this will be the second largest dataset of well integrity information in the United States.

Conclusions

- Sustained casing pressure is an easily measure, but poorly documented, gauge of oil and gas well integrity.
- Bradenhead testing in Colorado and New Mexico provides insight into the development of SCP in oil and gas wells and can be used to identify wells that pose a high risk of inducing stray gas migration.
- Image based documents of interest can be identified and sorted from databases that contain seemingly unmanageable numbers of files using TensorFlow.
- Data from these documents can be easily obtained using a simple document scraping web application.

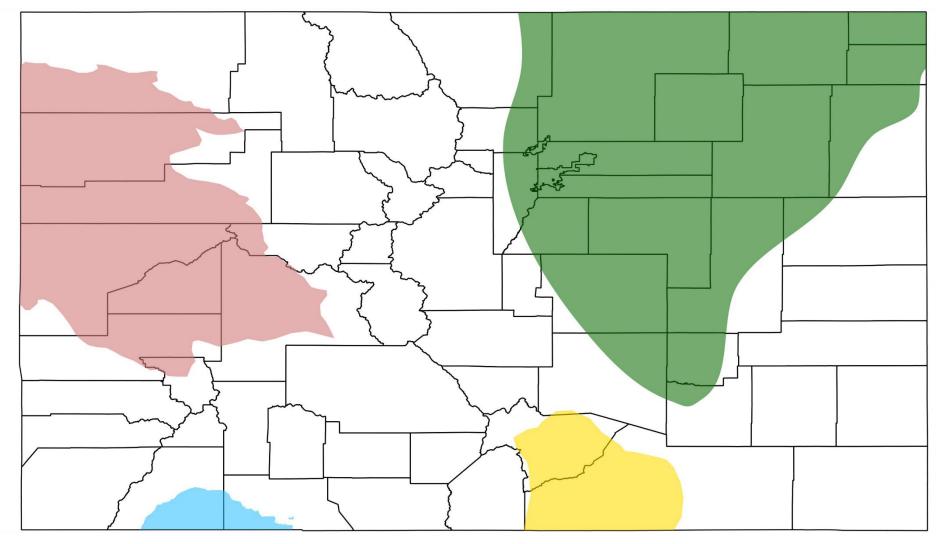
Acknowledgements

• National Science Foundation Sustainability Research Network Program (Grant CBET-1240584).

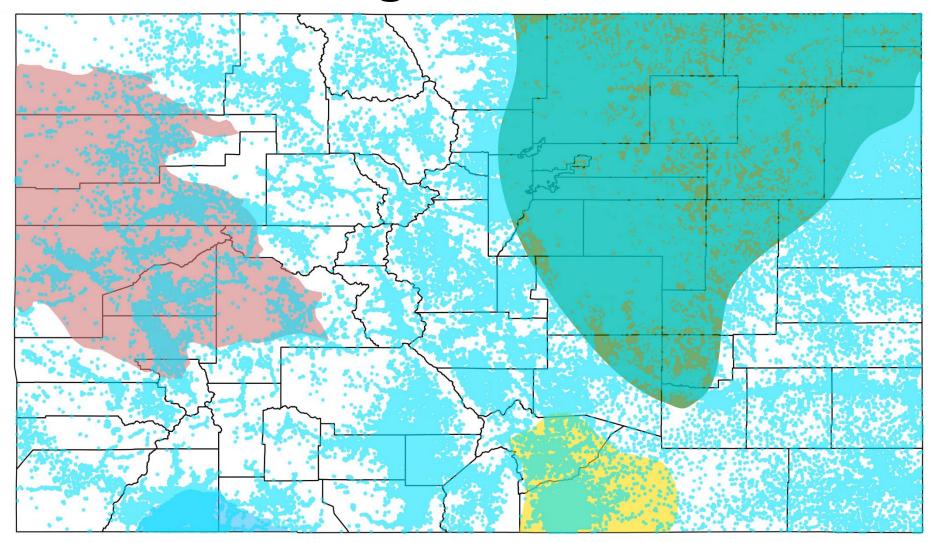
AirWaterGas Sustainability Research Network

- Harihar Rajaram, Owen Sherwood, Joe Ryan, Troy Burke, Devansh Chauhan
- Summer scrapers: Natalie Guinan, Steven Wilder, Lewis Schiebel, Marcus Knipp, Valerie Constien, Benjamin Willows, Ludvig Zwilgmeyer

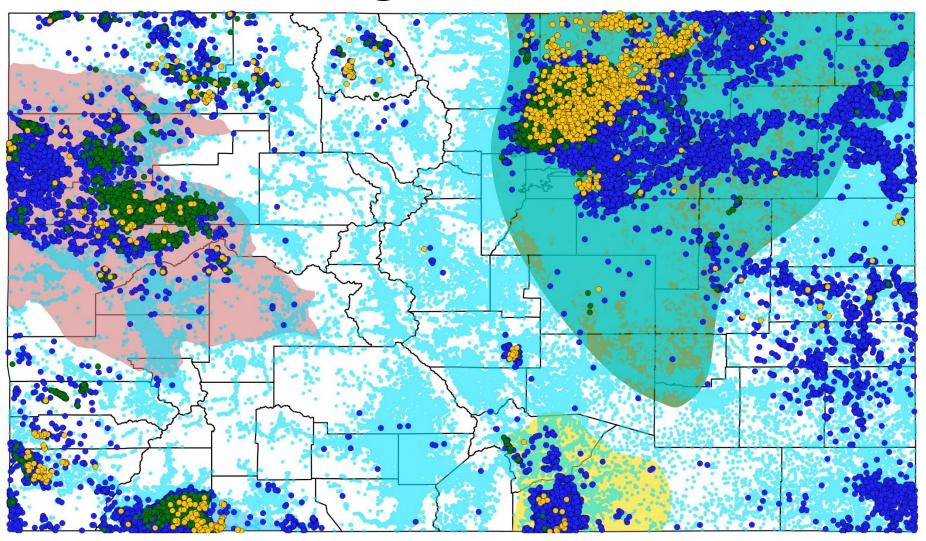
Extra Slides



Four major oil and gas basins: DJ, Piceance, San Juan, and Raton

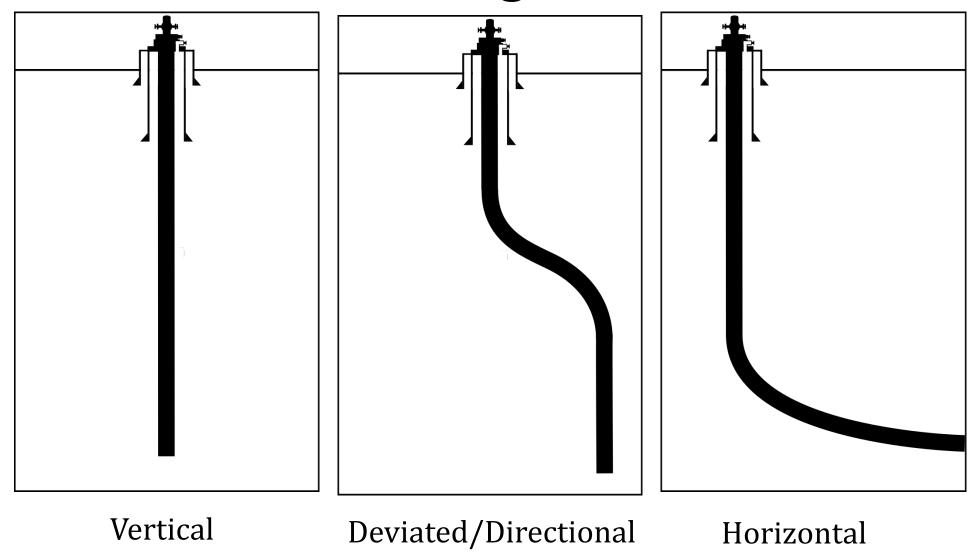


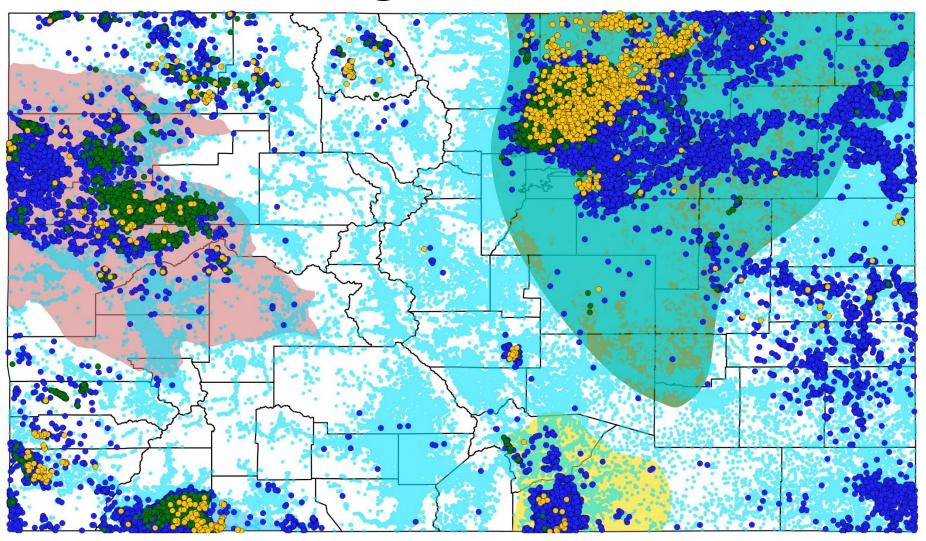
> 300,000 Water wells



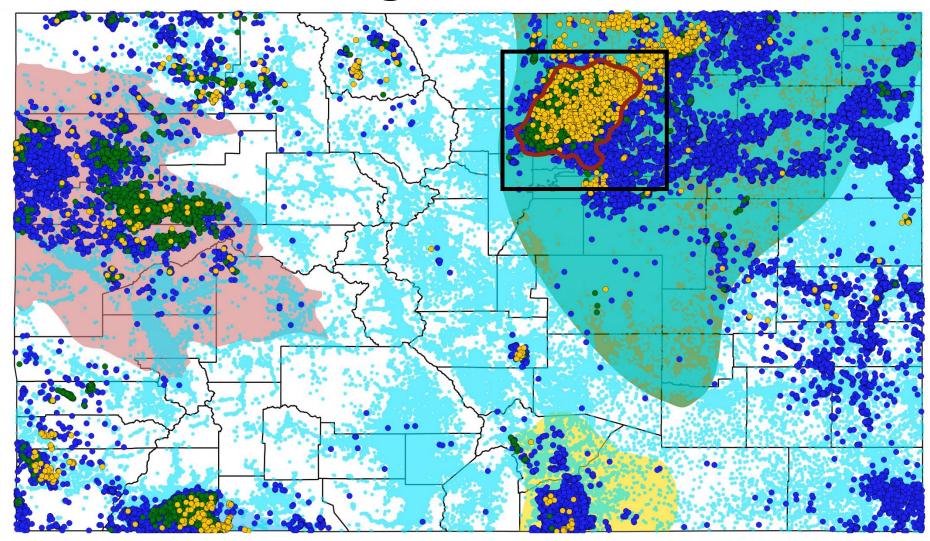
Total: 64,289; Vert: 42,279; Dev: 18,761; Horiz: 3,249

Well Configurations



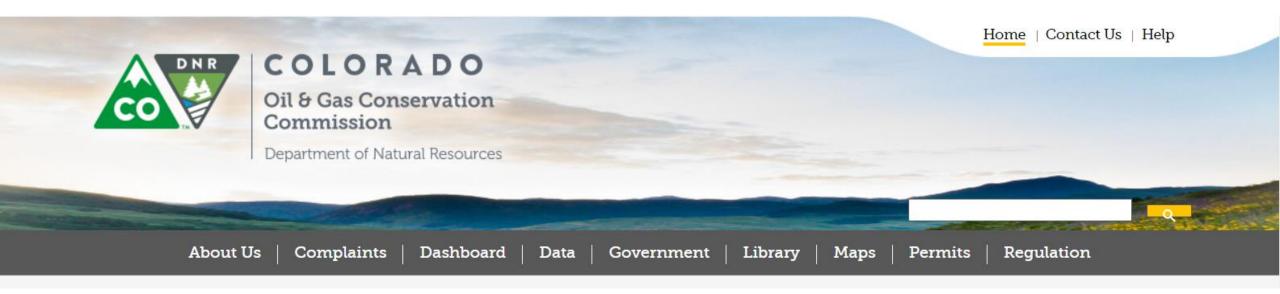


Total: 64,289; Vert: 42,279; Dev: 18,761; Horiz: 3,249



Total: 64,289; Vert: 42,279; Dev: 18,761; Horiz: 3,249

COGCC Data



cogcc.state.co.us

COGCC Data



cogcc.state.co.us



Python web scraping application