Seismicity induced by hydraulic fracturing and wastewater disposal in the Appalachian Basin, USA - a review

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Abstract

Eastern Ohio is an area of North America where a significant increase in seismicity rate was noted in the early 2010s. This increase has been associated with intensification of unconventional gas extraction performed in the Appalachian Basin and has been directly linked to two processes: hydraulic fracturing and disposal of the associated wastewater. In this paper we review the recent seismicity in the Appalachian Basin including various episodes of induced seismicity that were temporally and spatially linked to operational activity, but the activities have not been as pervasive as other areas of North America, such that the cases are typically isolated and provide opportunities to study the seismogenic process in detail. The observed seismicity is concentrated in a narrow corridor that extends north-south in eastern Ohio and into central West Virginia, perhaps due to differences in operational targets and geologic variations. Ohio appears to have a higher prevalence of seismicity induced by wastewater disposal than surrounding states, but this is based on limited number of cases. Ohio also has an order of magnitude higher prevalence of seismicity induced by hydraulic fracturing than surrounding states, and prior work has suggested this is due to the targeting of the deeper Utica-Point Pleasant formation in Ohio that is closer to basement rocks than the Marcellus formation in West Virginia or Pennsylvania. In areas where hydraulic fracturing has induced seismicity, the percentage of stimulated wells that produce detectable seismicity is approximately 10-33%. Detailed studies of induced seismicity via double difference relocation and focal mechanism analysis have revealed a series of linear fault segments, none of which correspond to previously mapped faults. Yet the remarkable coherence in their orientation suggests these were pre-existing, optimally-oriented, and critically-stressed. These fault orientations reveal a consistent regional stress field that only varies over a narrow azimuthal range from ~50°-74°. The strongest observed seismic events in Ohio appear to occur in the Precambrian basement and indicate that these rocks have the maturity needed to produce M>2 earthquakes and hence the greater potential hazard.

1. Introduction

An intensified extraction of unconventional gas and advanced technologies of underground fluid injection related to that process has caused a dramatic increase in the number of earthquakes in U.S. and Canada in the past decade (Ellsworth 2013; McGarr et al. 2015; Weingarten et al. 2015). Most of the seismicity contributing to that increase has been induced by wastewater disposal (WD) – the process of underground injection of water that flows back after hydraulic fracturing (HF), although some wastewater is simply produced from wells that have not had HF treatment (Walsh an Zoback, 2015). HF itself is also responsible for inducing seismicity, but the maximum observed magnitudes (M 4.6) are currently lower than that of WD-induced earthquakes (M 5.9) (e.g. Holland 2013; Friberg et al. 2014; Skoumal et al. 2015c; Atkinson et al. 2016; Bao and Eaton 2016, Chen et al. 2017).

The most pronounced increase in the number of induced earthquakes in North America was observed in central and southern USA – Oklahoma, southern Kansas and Texas, where Barnett and Woodford shale plays have been the target of operation and where wastewater has been disposed into the Arbuckle and Ellenburger formations overlaying crystalline basement (Frohlich et al. 2011; Holland 2013; Keranen et al. 2013; Keranen et al. 2014; Walsh and Zoback 2015; Schoenball and Ellsworth 2017). Other areas of recent seismicity induced by WD and HF include Colorado, Arkansas, Ohio, Pennsylvania, West Virginia, New Mexico, Wyoming, Illinois in the USA as well as Alberta and British Columbia in Canada (e.g. Schultz et al., 2018; Skoumal et al., 2018; Kozłowska et al. 2018; Lund Snee & Zoback, 2018).

In this paper we review the recent induced seismicity in the Appalachian Basin, where both WD and HF are being performed and have been shown to induce seismicity (Figure 1). The Appalachian Basin extends from New York state in the north to Alabama in the south, along the inland side of the

Appalachian mountains. It is a foreland basin built of sedimentary Paleozoic rocks hosting coal, oil, and natural gas deposits. Coal has been mined in Appalachian Basin already for three centuries, whereas oil and gas have been discovered in 19th century and exploited since then. However, gas production in Appalachian Basin radically changed beginning in 2005, when horizontal drilling and HF was first performed in Pennsylvania targeting the unconventional Marcellus Shale. Targeting and production from the Marcellus spread to comparable areas of West Virginia, but the Marcellus shallows and thins considerably in eastern Ohio. With advances in technology, the deeper Utica-Point Pleasant Shale became economically viable in eastern Ohio and operators began drilling and HF this target in 2011.

Pennsylvania and West Virginia have been producing natural gas from Marcellus shale play using classical vertical wells for years, however, since 2009 the number of horizontal wells stimulated has rapidly increased creating the need to dispose of large volumes of wastewater (EIA 2018b). Due to the limited disposal capabilities in Pennsylvania (9 disposal wells with low storage capacity), most of the wastewater has been trucked to Ohio, where it was injected underground into Cambrian, Ordovician and Silurian dolomites and sandstones (Kim 2013; Skoumal et al. 2014; 2015b; 2015c; Holtkamp et al. 2015). At that time, the number of horizontal drilling permits in Ohio was low, but ~2800 permits were issued for Utica-Point Pleasant shale plays drillings between 2011 and mid-2018 (ODNR 2018b). In the fourth quarter of 2017 alone, 1869 wells in Ohio produced over 14 billion m^3 of gas (ODNR 2018c) making Ohio the fifth largest gas producing state in the US in 2017 after being 19th in 2012 (EIA 2018b). As a whole, the dramatic increase of production in the Appalachian Basin makes it currently the largest natural gas producer in the USA (EIA 2018a).

Historically, Ohio, Pennsylvania, and West Virginia have had a low level of natural seismicity, with approximately 3 cataloged (M≥2) earthquakes per year from 1970 to 2009 during modern network recording (Figure 2). Much of this weak activity has been concentrated near the shore of Lake Erie and along the Rome Trough the follows the border between Ohio and West Virginia (Hansen and Ruff 2003) (Figure 1). However, this activity included a M 5.0 earthquake in 1986 near Perry, OH (Nicholson et al. 1988), which marked the beginning of a two-decade-long increased seismicity rate in Ohio (Figure 2) that will be discussed in section 2. Seismicity in Ohio then rises to even higher rates from 2010 to the present, including a M 4.0 near the city of Youngstown. This event and the accompanying seismicity rate increase were suspected to be associated with increase in WD and HF, and the strategies and seismic stations used to discern between natural and induced seismicity are reviewed in section 3 (. Although Pennsylvania and West Virginia have not seen similar large increases in seismicity rates, there have been a few cases of induced seismicity in the past decade. The specific cases across the Appalachian Basin that demonstrate the relationships between seismicity and operational activities are described in detail in sections 4 and 5. We then provide some geologic interpretations of induced seismicity in the Appalachian Basin in section 6.

2.   Potentially Induced Seismicity in 1986-2006

Previous studies have identified 3 earthquake sequences in the Appalachian Basin prior to 2010 as potentially induced: 1986 in Lake County, 1987 in Ashtabula County, and 2000-2003 again in Ashtabula County, all in northeast Ohio (Figure 1) (Nicholson et al. 1988; Seeber and Armbruster 1993; Seeber et al. 2004; Gerrish and Nieto 2005). The potential relationship of these events to injection activities have reached mixed conclusions, so we will reexamine the available evidence in this section.

To provide some context for interpreting the presence of previous seismic activity, northeastern Ohio had a history of ~30 earthquakes prior to the 1986 sequence dating back to the 1800s, which suggests this area is prone to natural seismicity (Nicholson et al. 1988). The seismicity correlates with the prominent Akron magnetic lineament, likely reflecting different lithologies in the Precambrian basement, and a first-order structural boundary interpreted from reflection data (Seeber and

Armbruster, 1993). Of these 30 prior events, 3 occurred close to the 1986 Lake County sequence: a body wave magnitude (mb) 4.5-4.7 earthquake in 1943 13 km west of the 1986 event, and two small events (mbLg 2.7 and 2.5) on 22 January and 19 November 1983, less than 5 km from one of the injection wells. The events in 1983 occurred about 30 km from the 1987 and 2000-2003 Ashtabula County sequences, but there are no other known earthquakes within 30 km prior to 1987. Seismicity has continued in Lake and Ashtabula Counties since 2010 (Figure 1), but detailed analysis of recent earthquakes found the seismicity did not occur as long swarms and epicenters were greater than 10 km from active wastewater disposal wells and the older wells suspected to have induced seismicity in the 1980s (Skoumal et al. 2015c). These findings were interpreted as evidence the Akron lineament represents a deep fault zone that has continued to host recent small earthquakes of the same natural origin as those prior to 1986.

On 31 January 1986, a mb 5.0 earthquake occurred near the southern border of Lake County followed by 13 aftershocks of duration magnitude (Md) 0.5-2.5 on 1 February - 24 March 1986 (Nicholson et al. 1988), with an additional mb 2.8 aftershock on 28 December 1988. Two basement-penetrating Class I nonhazardous waste disposal wells ~12 km from the sequence began full-scale injection in 1975 and 1981 into the basal Mt. Simon (1836 m) and Conasauga (1720 m) formations (Nicholson et al. 1988). Injection up ~636 m^3/day and ~11 MPa at these wells was suggested to have induced the events 5-11 years later when the effects of injection reached the fault (Nicholson et al. 1988). Nicholson et al. (1988) estimated the critical stresses needed to induce fault slip and concluded that without fluid injection the conditions were near, but did not exceed, the necessary stresses to produce failure. However, the modeled pressure increase at the hypocenter was likely less than 0.34 MPa. Injection continued until the wells were plugged in 2004, but the seismicity was quiescent in this area after the initial sequence with only a mb 2.0 earthquake in 2003 ~5 km to the east, and a mb 2.3 earthquake in 2006 ~8 km to the northwest. Fischer (1990) noted that this pattern of seismic activity is atypical of other sequences of allegedly induced earthquakes. While this event is now generally considered to be natural, the influence of the injection wells cannot be ruled out.

In July 1987, a separate sequence of 36 earthquakes, mbLg -1.1-3.8, occurred in Ashtabula County, ~45 km northeast of the 1986 sequence (Figure 1). These events outlined a 1.5 km fault less than 1 km from an injection well drilled into the basal Mt. Simon (1792 m) and Conasauga (1667 m) formations that began operation approximately a year earlier (Seeber and Armbruster 1993). The waste disposal well was plugged in 1994, and there was an average of one felt earthquake per year between 1987-2003 (Seeber et al. 2004). Intriguingly, earthquake sequences occurred again in 2000-2001 and 2003 about 5 km from the well and included a mb 4.3 event. The initial 1987 earthquake sequence was labeled as induced given the close proximity in space and time to the injection well operations (Seeber and Armbruster 1993), and a later study attributed the 2000-2003 seismicity to the migration of high pore-fluid pressures from the WD well (Seeber et al., 2004). However, pore-pressure modeling for the full Ashtabula seismic sequence by Gerrish and Nieto (2005) found no correlation between injection rates or pressures and the timing of the earthquakes. Instead, the seismicity follows a traditional mainshock-aftershock pattern common to natural earthquakes with the largest magnitude occurring first and the seismicity rate decreasing with time after the initial event. This lacks the swarm-like patterns common to induced sequences such as those at Rocky Mountain Arsenal (Healy et al. 1968), where there are typically a few events near the largest magnitude later in the sequence and the seismicity rate is stable or even increasing with time. Gerrish and Nieto (2005) argued that while Coulomb failure theory cannot rule out triggering of the initial mainshock by the injection operations, the probabilities of shear failure due to effective stresses at the hypocenter are low. Moreover, the same authors noted that there is even less evidence for injection to be inducing new earthquake sequences several kilometers away over 5 years later. Instead, they pointed to the historical seismicity along the southern coast of Lake Erie and that the focal mechanism was consistent with tensile failure of basement lithologies along vertical fractures oriented parallel to the major principal regional stress field.

3.   Seismic monitoring and detection of induced earthquakes in the Appalachian Basin

Due to the low level of natural seismicity, Ohio did not have a state-sponsored continuous seismic monitoring network. l In 1999, the Ohio Seismic Network (OhioSeis) was established and consisted initially of 15, and later even 29 vertical-component midperiod seismometers located primarily at colleges and universities across the State which expressed their willingness in hosting the station as part of their geology outreach (Hansen and Ruff 2003). As a result, the distribution of stations was not uniform. Today the OhioSeis is operated by ODNR and includes 11 permanent broadband stations. Four stations were originally deployed as part of USArray in 2012 and 2013 under the EarthScope Project. They were adopted by ODNR and are now used to monitor seismicity in eastern Ohio. Another 10 former USArray stations are still operating in Ohio as a part of Central and Eastern U.S. Network (CEUSN). West Virginia does not operate a state-wide seismic network, but has also benefited from 7 former USArray stations operating as part of the CEUSN.

The Pennsylvania State Seismic Network began in 2006 through a partnership between Pennsylvania State University and the Pennsylvania Department of Conservation and Natural Resources (DCNR). Between 2006 and 2013, the network grew to a total of 10 seismic stations spread across the state providing near real time, open access data (Homman, 2015). Prior to the arrival of the USArray Transportable Array in 2012, Pennsylvania pre-adopted several stations that were critical for monitoring several early cases of induced seismicity (Skoumal et al. 2014, 2015c). Between 2015 and 2016, an expansion of the network to 30 seismic stations began with funding from the DCNR and the Pennsylvania Department of Environmental Protection.

The initial detection and location of induced seismicity in Ohio has typically been accomplished by ODNR using the existing stations at the time. However, the lack of short-period local stations limited the detection and location of weaker events during early sequences. For example, after detecting a few earthquakes in Youngstown close to a disposal well, ODNR and Lamont-Doherty Earth Observatory deployed a local network in late 2011 to monitor the seismicity in the area (Kim, 2013, Section 4.1). Similarly, local short period stations were deployed temporarily by ODNR around WD and HF wells of interest (Sections 4.2 and 5.1). Miami University contributed to observations of induced seismicity in the area by deploying additional broadband stations in Harrison, Guernsey, Belmont, Noble, and Monroe Counties, starting in October 2014. A few WD and HF operators have installed their own dedicated seismic networks in the area of operations but those data are usually not available to the public (Section 4.3 vs. 5.3 and 5.4).

ODNR currently utilizes the existing stations to perform earthquake detection and location via an Earthworm system to generate its catalog. To perform more in-depth analyses of recent seismicity, the detection process has been enhanced via template matching and Repeating Signal Detector (RSD) (Kim 2013; Friberg et al. 2014; Skoumal et al. 2014; 2016). Both tools are based on seismic signal similarities expressed in the form of correlation coefficients (CC). In the template matching procedure, one or a few relatively strong and well recorded events are chosen as templates and used to scan through continuous waveforms from the same stations, searching for signals that produce high CC. RSD creates templates by using a clustering algorithm to identify groups of similar events based on comparisons in the time and frequency domains. Template matching and RSD have been effective in lowering the detection level 2 to 3 orders of magnitude compared to the ODNR based catalog with simultaneous low numbers of false detections (Skoumal et al. 2014; 2016). Both procedures determine the local magnitudes of detected events using a Richter scale approach.

The Gutenberg-Richter frequency magnitude distributions (Gutenberg and Richter 1944) were typically calculated following the maximum-likelihood estimation or the least-squares linear approach. To help compare the nature of the frequency magnitude distributions for the various cases discussed in this study, we have applied a uniform maximum-likelihood estimation of the b-value to

all cases using the catalogs from previous studies (Bender, 1983) (Figure 3). In some cases, we found that a truncated Gutenberg-Richter estimation using the equation of Caputo (1976) provided a better fit to the observed distribution. In all cases, we determined the M_C using the maximum curvature algorithm (Wiemer and Wyss, 2000).

Most of the induced sequences discussed in sections 4 and 5 were relocated using the *hypodd* double-difference algorithm (Skoumal et al. 2014; 2015a; 2015b; 2018; Kozłowska et al. 2018). These studies have each used a 1D velocity model originally derived for eastern Ohio and adjusted to local conditions. The location uncertainties were typically determined using bootstrapping, and they depended on the number of stations available and their epicentral distance. In the case of Harrison Co and Trumbull Co where local stations were available, the absolute and relative location uncertainties were of the order of 100-150 m for both horizontal and vertical directions. In cases without a local network, the absolute location uncertainties were of the order of 1 km in the horizontal direction and potentially larger for the vertical direction.

Determination of whether seismicity was induced or natural followed the strategy of Skoumal et al. (2015c). The general approach to classifying induced seismicity has been to identify (1) an appropriate anthropogenic source that is potentially influencing the effective stress on a fault, (2) a correlation in timing of the human activity with the seismicity, and (3) a correlation in location between the potential source and the earthquake hypocenters (e.g., Davis and Frohlich, 1993). The Skoumal et al., (2015c) study demonstrated that these criteria can be complemented by evidence for swarminess, where there are many events relative to the maximum magnitude observed, the largest magnitude event is not first, and there is a lack of aftershock decay pattern. Determining the presence or absence of swarm-like behavior can be aided by template matching. Figure 1 shows the results of classifying all cataloged events in the Appalachian Basin with this strategy.

Table 1. Overview of injection-induced seismicity in the 3 primary States of the Appalachian Basin operational activity.

Region	Wells with Earthquakes	Wells with Earthquakes	Total Wells	Maximum Magnitude
Wastewater Disposal Wells				
Ohio (All)	1.5%	3	201	4.0
West Virginia (All)	0.8%	1	127	3.4
Pennsylvania (All)	0%	0	9	-
Hydraulic Fracturing Wells				
Ohio (All)	2.7%	48	1751	3.7
West Virginia (All)	0.3%	6	2148	2.7

Pennsylvania (All)	0.05%	4	8706	1.9
Monroe Co.	33%	8	25	3.0
Harrison Co.	21%	21	99	2.8
Mahoning/Lawrence Co.	17%	9	54	3.0
Noble/Guernsey/Belmont Co.	10%	14	140	3.7

4.   Documented episodes of seismicity induced by WD

Only three seismic sequences in Ohio have been associated with WD (Figure 1, Table 1) (Kim 2013; Skoumal et al. 2014; Skoumal et al. 2015b; 2015c), which means that 1.5% of the total number of active class II wells in Ohio (217 - as of April 3rd 2018, Ohio Department of Natural Resources - ODNR 2018a), have induced seismicity that can be detected with current seismic monitoring technologies. For comparison, West Virginia has only had 1 WD well that induced seismicity (Skoumal et al., 2018), leading to a smaller percentage of WD wells associated with induced seismicity (0.8%, Table 1). Pennsylvania has had no cases of WD induced seismicity although this state has many fewer WD wells. While no state-wide traffic-light protocol is in place for WD, injection has been halted in Youngstown and Trumbull County, Ohio and Braxton County, West Virginia (Sections 4.1, 4.3, and 4.4).

4.1. Youngstown, Ohio
The largest magnitude sequence of induced seismicity in the Appalachian Basin in the past decade was identified when ODNR reported 10 earthquakes of M~2 close to Youngstown, starting from March 2011. Following a local deployment, the proximity of located earthquakes to an active class II well indicated the sequence was likely induced (Kim 2013). As a result, the injection was ceased on 30 December 2011, however, just a day later the strongest M4.0 event occurred less than 1 km from the well. Template matching revealed 566 similar, co-located seismic events, with the first event occurring 13 days after the injection began in December 2010 (Skoumal et al. 2014). The double-difference relocation of earthquakes showed the elongated cluster of seismicity trending ENE-WSW, starting 100 m SW from the well (Figure 4a). Earthquakes occurred at the depth between 3.5 and 4 km, in Precambrian crystalline basement. Their spatiotemporal distribution showed that they migrated away from the well with time. The focal mechanism of the strongest event was consistent with the linear trend of the cluster indicating that the whole sequence occurred along near vertical, left-lateral basement fault.

Our estimation of the b-value for the whole sequence (1.56, Figure 3a) is higher than that from a linear least-squares fit (0.82), but Skoumal et al. (2015b) interpreted this is likely due to the sequence not following a log–log power law distribution. This could be due to FMD being quite different in earlier phases than later phases (Skoumal et al., 2014). The construction of a basement fault structure model and the estimation and simulation of pre- and post-injection stress state performed by Morris et al. (2017) contributed to understanding the inducing process of the Youngstown sequence. Their comparison of reported injection pressures and simulated pore pressure pore pressures enough to induce fault reactivation. In particular, the combination of low permeability basement host rock and high permeability fault zone amplified the pore fluid pressure perturbation

and increased the likelihood of fault reactivation given the fault zone was appropriately oriented. The effective permeability of the injection interval increased in the downward direction as injection progressed leading to a larger, connected fault area, culminating in the large slip of M4.0 event.

4.2. Washington County, Ohio

The first recorded seismic event in Washington County occurred in October 2010 and had a magnitude of 2.8 (Skoumal et al. 2015c). Just two weeks after the event, the EarthScope TA stations were deployed in western Pennsylvania and they were used for template matching on subsequent events. The procedure revealed a pattern of ongoing seismicity with over 100 events detected between 2011 and 2013. The strongest event in the sequence occurred in August 2011 and was of magnitude 3.1. The location of 5 template events showed that they were all located close to each other, less than 2 km from WD well which started injection in September 2008. The frequency magnitude distribution of this sequences has a relatively low b-value (0.86, Figure 3b), but there are indications of a divergence from the expected log–log power law distribution as seen in the Youngstown case.

In 2013 ODNR deployed a local network of five stations in the area of observed seismicity. Currie et al. (2018) analyzed their data between May 2013 and July 2015 and performed multi-station template matching identifying over 300 events down to magnitude -0.7. The double difference relocation of these events with the local network (Figure 4b) showed they were close to the earlier events analyzed in the previous study but closer to the injection well. The relocated hypocentral depths correspond to lower Cambrian and upper Precambrian strata, reported by Baranoski (2013). The epicenters formed elongated cluster with NE-SW trend that Currie et al. (2018) also found parallels the trend of small-amplitude folds in Upper Paleozoic rocks and is optimally oriented within the regional stress field. Hypocentral patterns and similar structures imaged in nearby seismic reflection lines indicate the seismicity occurred on a positive flower structure initiating in the basement and separating into braided segments in the sedimentary layers. These basement-involved fault systems cut the injection interval targeted by the WD well, providing permeability pathways for fluid pressure increases that would promote seismic slip. Well completion records indicate the nearby WD well was injecting fluids close to or above the fracture pressure of the targeted Silurian interval. As expected, seismicity rates followed the monthly injection rates during the studied time frame. Taken together, Currie et al. (2018) concluded the seismicity was the result of pore pressure change caused by WD, similar to the Youngstown sequence.

4.3. Trumbull County, Ohio

The first earthquake in Trumbull County was reported by ODNR and U.S. Geological Survey in August 2014. The ML 2.1 event was located within 1 km of two class II wells, the shallower one injecting water into Silurian strata and the deeper one into sediments ~15 m above the Precambrian basement (Skoumal et al. 2015b). Following the event, ODNR ordered the suspension of operations at both wells, but two weeks later the operation was resumed at the shallower well after the investigation stated that it did not influence the occurrence of the ML 2.1 earthquake. Template matching was performed for both regional and local data – the operator deployed a temporal network of 4 short-period stations within 4 km from the wells. The procedure identified over 100 events in the 3 months leading up to the shutdown. Double difference relocated earthquakes formed two clusters (Figure 4c), one adjacent to the deeper well and the second ~400 m southwest and few hundred meters below the bottom of the well, in the Precambrian basement. The clusters differed also in their spatial distribution– the proximal one had a ENE-WSW trend similar to the Youngstown sequence, whereas the distal one that formed later followed a NNE-SSW trend (Skoumal et al. 2015b). The distal cluster also included the ML 2.1 event, for which a fault-plane solution revealed a strike-slip mechanism with the north-south fault plane aligning with the trend of hypocenters. Despite the different azimuths, both observed trends of seismicity in Trumbull County are optimally oriented relatively to the NE-SW orientation of the maximum horizontal stress SHmax (Hurd and

Zoback 2012). The rate of seismicity in the area dramatically decreased after the injection was halted at both wells and it has not yet returned after the shallow well was resumed, indicating a correlation to the deep well injection.

The b-value for Trumbull County seismicity is essentially 1 (1.00, this study; 0.91, Skoumal et al. 2015b), but the initial study noted that the FMD does not follow a power law due to a few much larger events and suggested a different relationship is at work. This observation, along with lack of aftershock productivity and narrow magnitude range, is predicted by numerical simulations of a seismogenic zone governed by a viscoelastic damage rheology when the viscosity in the fault zone is reduced (Ben-Zion and Lyakhovsky, 2006). Such a reduction in viscosity is expected if deep WD increases fluid pressures in the fault zone to the point that the fault zone begins to dilate.

4.4. *Braxton County, West Virginia*

Seismicity in Braxton County began with a series of 8 earthquakes between April and July 2010 within a few kilometers of an active wastewater injection well (Figure 4d), including a M 3.4 event. The West Virginia Department of Environmental Protection (WVDEP) reduced the injection rate at this well soon after these events began, and WVDEP further restricted both the volume and the rate after an additional M 2.8 earthquake occurred in January 2012. The well was shut-in at the end of 2013 after another M 3.4 event occurred in March 2013. Template matching utilizing existing stations in the region over this time frame grew the catalog of detected events to 54 (Skoumal et al., 2018), revealing a distinct decrease in seismicity rate once the rate and volume reductions were enacted, which was not visible with the NEIC catalog alone. Although double difference relocations have not yet been performed on this sequence, the catalog locations appear to follow a northeast-southwest trend that parallels a fault plane from the focal mechanism of the largest event (Figure 4d). The Rome Trough Eastern Margin Fault appears to occur in the vicinity of the well and follow a similar orientation, with structural evidence that the fault cuts the injection interval (MRCSP, 2009; McDowell et al., 2014). The frequency magnitude distribution of this sequences is similar to that of Washington Co., Ohio that occurs on the western margin of the Rome Trough (Figure 1). The b-value is relatively low (0.69), but there are indications of a divergence from the expected log–log power law distribution as seen in the other WD cases.

5. Documented episodes of seismicity induced by HF

In this section we show a review of cases of seismicity induced by HF in Ohio which are important for understanding the relationship between seismicity and operational activities. Table 1 summarizes the HF induced seismicity in the Appalachian Basin, with most cases occurring in Ohio and growing in prevalence since 2012. Increases in oil and gas production and rising seismic hazard led to introducing state regulations concerning seismic monitoring and traffic light system for HF wells operations. HF operators are required to monitor potential seismicity if the permitted well is located within 3 miles (~3.8 km) from known fault or previous seismicity (ODNR 2017). The ODNR regulations require direct communication between the operator and Division of Oil and Gas Resources if a local magnitude ML 1.5 or higher event occurs during operation, modification of operation if ML 2.0-2.4 event occurs, temporal halt of operation if ML 2.5 or higher event occurs and suspension of the whole pad completion until an approved plan is submitted by operator if ML 3.0 or higher event occurs. As far as we know, these regulations or earlier forms of them have been employed to halt completion operations at wells in Poland Township and Noble County cases (Sections 5.2 and 5.3).

5.1. *Harrison County, Ohio*
The induced seismicity occurring in Harrison County has formed a series of seismic sequences from 2013 to 2017 (Friberg et al. 2014; Skoumal et al. 2015c; Kozłowska et al. 2018). Seismicity in Harrison County was caused by HF performed on 9 well pads in the southern part of the county (Figure 5a).

The first earthquakes in the area were recorded in October 2013 by USArray stations operating in eastern Ohio. By November 2013 ODNR deployed 4 portable short-period stations close to the epicenters of recorded events. The initial sequence lasted until the end of 2013 (Figure 5b) and was located directly below the Ryser wells (Friberg et al. 2014). In the following years, another 5 well pads induced productive seismic sequences (>500 detected events) in an area of only ~5 km length and ~2 km width. Utilizing recordings from an EarthScope station located only a few kilometers north of the HF wells, a repeating seismicity detection procedure utilizing agglomerative clustering of frequency and time domain signals was able to identify over 13,000 seismic events from the beginning of 2013 until the end of 2015 (Skoumal et al. 2016). An additional sequence associated with the Conotton well pad stimulated in November 2016 was also detected, but detailed analysis of this sequence is currently in progress (Friberg et al., 2018). Despite all of this seismicity, the magnitudes have not exceeded ML 2.8. Hence, HF operations have generally continued without interruption, although activities on the Hamilton and Conotton pads were adjusted and/or temporarily paused (ODNR, pers. comm.).

Table 1 summarizes the prevalence of HF induced seismicity in the southwestern area of Harrison County shown in Figure 5a by taking the number of HF wells that have induced magnitude > 1 seismicity (21) divided by the total number of HF wells in a 20 km wide box that encloses the area where induced seismicity has occurred (99). The resulting percentage (21%) is an order of magnitude higher than the percentage we obtain for the whole state of Ohio, indicating that certain areas of the state have a higher likelihood of induced seismicity than others. This issue is discussed in detail in section 6.

The double-difference relocation performed on the productive earthquake sequences between 2013 and 2015 showed that all induced events occurred at a small epicentral distance from the nearest recently active HF stage – less than 1 km (Kozłowska et al., 2018). The time lag between hydraulic stimulation and the seismic response was very short, approximately 120 min, clearly indicating the inducing relationship. However, such a short response time compared with distance between HF and first seismic event would translate into an abnormally high values of hydraulic diffusivities. In this case, pore pressure diffusion is not likely the primary factor inducing seismicity and poroelastic stress is a better candidate for the physical mechanism responsible for initiating the seismicity (Kozłowska et al. 2018). The horizontal distribution of located events shows quasi-linear trends consistent with east-west fault plane solutions that are optimally oriented 30° from SHmax (Kozłowska et al. 2018). The depth distribution of events, however, shows that seismicity observed in Harrison County occurred on two separated levels: 1) within Paleozoic sedimentary rocks about 400 m below the target interval and 2) about 600 m deeper than the first level in the Precambrian basement. Interestingly, sequences characterized by greater depth showed low b-value (< 1; Figure 3i-j), whereas sequences located in Paleozoic strata showed b-values much higher (generally >1.5; Figure 3n-o). Interpreting these results in the context of recent laboratory work and the knowledge of local geology, Kozłowska et al. (2018) proposed the two observed types of seismicity represent the activation of a fault system originating in the Precambrian basement and continuing into Paleozoic strata. Due to the age and inferred difference in slip history, activated faults would differ in surface maturity leading to different FMD patterns: old, mature Precambrian faults have a smoother surface which would promote larger slip, and hence, larger magnitude seismic events than younger, less mature and thus more rough Paleozoic faults. An investigation of the water and gas production data also revealed that wells inducing deeper seismicity produced more water than wells with shallow seismicity, indicating more extensive hydrologic connections outside the target formation.

5.2. Poland Township, Ohio and North Beaver Township, Pennsylvania

A new sequence of seismicity reaching ML 3.0 appeared in Mahoning County in March 2014, but this time the seismicity was focused in Poland Township, 18 km southeast of the Youngstown sequence (Skoumal et al. 2015a). Although there were no local stations during this sequence, it was located within 1 km of an active HF well (Figure 5c), and completion was suspended after the ML 3.0 event.

Template matching was performed using regional data revealing 60 seismic events primarily occurring during 6 stages on 2 well laterals that were closest to the hypocentral locations, although a small amount of seismicity persisted for a few days after these stages. The location of the strongest of detected events showed that they formed an east-west band parallel to Youngstown seismicity and consistent with a fault plane solution for the largest event (Figure 5c). The sequence occurred 500 m below the target Utica-Point Pleasant formation at the top of the crystalline basement. We calculated a relatively low b-value of 0.91 (Figure 3f), similar to the 0.89 estimated by Skoumal et al. (2015a) and consistent with the deeper cases of basement seismicity from Harrison County (Figure 3i-j). The Poland Township FMD is also linear, but it does not appear to be truncated like some cases of Harrison County although those cases lasted significantly longer (several weeks to months).

Approximately 2 years later, seismicity began again in North Beaver Township, Pennsylvania ~6 km east from the Poland Township sequence (Figure 5c-d). Template matching was performed using a template event reported by USGS and two regional TA stations (Skoumal et al., 2018). It revealed a seismic swarm with two main clusters temporally and spatially correlated with individual stages of HF performed at two well laterals being "zipper" stimulated (alternating stages between wells). Following the strongest ML 1.9 event, the operator voluntarily halted operations at the well and seismicity soon stopped. Relocation of the observed swarm showed that it formed an east-west trend, similar to the Poland Township cluster. Although the absolute depth of this sequence is poorly determined, the FMD is most similar to that of the deeper Harrison County wells (Figure 3m). The wells in North Beaver Township targeted the Utica and Point Pleasant formations, which is rare in Pennsylvania, as nearly all other wells target the shallower Marcellus Shale. None of the wells targeting the Marcellus in Pennsylvania currently have documented induced seismicity (Skoumal et al.,2018). Table 1 summarizes the prevalence of induced seismicity associated with wells operated in the combined area of Mahoning and Lawrence Counties near the Ohio-Pennsylvania border. There are 45 well laterals without seismicity in this 20 km wide box, indicating 17% of wells have induced seismicity, similar to what we calculated for southwest Harrison County.

5.3. Belmont/Guernsey/Noble Counties, Ohio

About 15 km south of the Harrison County seismicity, a sequence of five ML ~2 earthquakes near the border of Belmont and Guernsey Counties was reported in May 2014 in EarthScope catalog (Skoumal et al. 2015c), with the strongest event reaching ML 2.6 (Figure 5e-f). Due to poor station coverage, only the four largest events were located with large uncertainties (~1.5 km), however, the location was near the active Kirkwood well pad targeting the Utica-Point Pleasant formation. The temporal analysis of events showed that they occurred during HF operations on two laterals being zipper stimulated, with the main cluster occurring during stimulation of 8 consecutive stages with a trail of seismicity lasting for ~3 days after a pause in the operations. The b-value and FMD pattern was not reported by Skoumal et al. (2015c), so we have calculated this is Figure 3k. The b-value (0.79) and truncated shape of the FMD are quite similar to the deeper Harrison County sequences.

Seismic activity occurred again in August 2016 about 3 km southwest of the first sequence when a M2.3 event was reported by ODNR (Figure 5e-f). Although this sequence has not been studied in detail, we performed template matching with station O53A and found 61 events over a month duration. This sequence coincides in space and time with activity at the Wheeler well pad targeting the Utica-Point Pleasant. Seismicity primarily occurred during zipper stimulation of the last ~12 stages of 2 laterals (7H and 9H) that were closest to where the May 2014 seismicity occurred. Seismicity continued at a slower rate for over 3 weeks after the stimulation ended. The b-value (0.74) and truncated shape of the FMD are similar to the May 2014 sequence (Figure 3l).

Less than a year later in April 2017, seismicity occurred ~15 km south of the Belmont/Guernsey sequences in neighboring northeastern Noble County (Figure 5e-f). Two events with ML 1.6 and 2.4 reported by ODNR and located directly below an active Wehr 2H horizontal well. Following those events the completion of the well was suspended and no further seismicity was recorded during

completion of nearby Slash wells until six weeks later, when ML 3.7 event occurred during the stimulation of the Wolf 2H well. This event is thus far the strongest HF-induced event in Ohio and was widely felt in the rural epicentral area - over 100 felt reports were submitted to USGS. Intriguingly, only 18 events were detected with template matching and repeating signal detection. Double difference relocation has not been attempted on this sequence, but a focal mechanism shows an east-west fault plane similar to events in Harrison County (Figure 5e). Given the small number of events detected in this sequence, it is difficult to calculate a b-value that is meaningful, but the FMD clearly shows a non-power law distribution (Figure 3p) similar to the shallower Harrison County cases.

5.4. Monroe County, Ohio

Seismicity in southwestern Monroe County was first observed in December 2016 when three events with magnitudes 2.0-2.3 were reported by ODNR. These events correlated in space and time with HF activity on the Donato well pad (Figure 5g-h), although the highest seismicity rate occurred immediately after a lateral finished. Two more magnitude 2.4 earthquakes were detected on March 30, 2017, followed by a magnitude 3.0 earthquake on April 2. These events occurred in a similar location to those in 2016, although the HF wells operating at the time (Gary Green and Jacobs well pads) were a few kilometers further north (Figure 5g). The strongest (3.0) event occurred right after flowback on the Donato well pad commenced (ODNR, pers. comm.), suggesting this process played a role. The b-value and linear FMD (Figure 3g) resemble that of the post-HF seismicity associated with the deeper Harrison County well pads. At the time of this study, only a handful of well pads have been operated in southwestern Monroe County. Hence, the percentage of HF wells inducing seismicity (33%) appears to be highest in this region (Table 1).

5.5. Gilmer County, West Virginia

A short sequence of seismicity occurred in Gilmer Co. between July and August 2013. Using 5 cataloged earthquakes that reached a magnitude of 2.7, template matching was able to reveal 161 unique events (Skoumal et al., 2018). Seismicity began soon after HF started and ending soon after the last completion, with 5 laterals completed on this well pad that was ~3 km from the cataloged epicenters. No other horizontal wells have been hydraulic fractured in this county of West Virginia, but the WD-induced seismicity in West Virginia occurred ~20 km south in the neighboring Braxton Co. The b-value and FMD pattern was not reported by Skoumal et al. (2018), so we have calculated this is Figure 3h. The b-value (0.63) and linear shape of the FMD resemble that of Monroe Co and the post-HF seismicity associated with the deeper Harrison County well pads.

6.   Interpretation

Our review of induced seismicity in Ohio and surrounding regions highlights that the prevalence varies a lot spatially, and in some localities the prevalence is significantly higher than previously thought. At the state scale, we find that the prevalence in Ohio is higher than West Virginia for both WD and HF, which in turn is higher than Pennsylvania for both. The explanation for this proposed by Skoumal et al. (2018) is that the distance between operations and the Precambrian basement where faults are expected to be more mature is quite a bit larger in Pennsylvania and West Virginia than Ohio. The area of West Virginia where induced seismicity is occurring is thought to be the southern edge of the Rome Trough and may represent an area where faulting is more pronounced and extends further up into the Paleozoic sedimentary rocks (Skoumal et al., 2018). An intriguing difference from previous studies is that Ohio now has a higher per-well prevalence for induced seismicity from HF than from WD. This is counter to the interpretation that WD has a higher likelihood of producing seismicity than HF due to longer duration injection and hence larger total volumes (e.g., Rubinstein and Mahani, 2015). The best interpretation may be similar to that of

Skoumal et al. (2018) in that most HF wells are injecting closer to basement than most WD wells. When we examine the regions of induced seismicity in further detail, we find that the prevalence of HF induced seismicity over a 20x20 km wide region can be even higher, with numbers ranging from 10-33%. This suggests that local variability is important and still plays a big role in determining the risk of induced seismicity.

Despite the local variability in the prevalence of induced seismicity, there is remarkable coherence in the orientation of faults that have induced seismicity. Many of these sequences have created extensive sequences of similar events with nearby recordings to allow for double difference relocations that reveal linear fault segments (Friberg et al. 2013; Skoumal et al. 2014; 2015a; 2015b; 2018; Kozlowska et al. 2018; Currie et al. 2018). In addition, many of these sequences have produced a large enough event to determine focal mechanism (Kim, 2013; Friberg et al. 2013; Skoumal et al. 2015a; 2015b; 2018; Kozlowska et al., 2018). Remarkably, all of these fault orientations are ~30 degrees from the expected direction of SHmax (Hurd and Zoback 2012). None of induced sequences occurred on a known, mapped fault, but the consistency suggests these were pre-existing, optimally-oriented, critically-stressed faults. This is supported by the geomechanical modeling of the stress evolution in the Youngstown case that showed a pre-existing fault needed to be in a critical stress state before the onset of seismicity in order for the modest increases in pore pressure associated with WD to cause seismic slip (Morris et al. 2017). Figure 5 shows the orientations of SHmax estimated by assuming a 30 degree offset from the fault orientations from recent HF and WD induced seismicity, as well as the two older possible cases of injection induced seismicity. This analysis reveals a consistent regional stress field that only varies over a narrow azimuthal range from ~50°-74° (Figure 5). This trend is consistent across a nearly 400 km long north-south extent.

Finally, we turn our attention to the fact that induced seismicity has been essentially restricted to relatively narrow north-south corridor along eastern Ohio and into central West Virginia. One possibility is that this corridor represents a zone of more intense faulting during previous orogenies, but the lack of any prior natural seismicity in eastern Ohio (Skoumal et al. 2015c) argues against this idea. Another possibility is that it is simply due to the geography of operational activities, but there are just as many HF wells east and west of the seismicity corridor and just as many WD wells to the west (Figure 1). However, the HF wells to the east of this corridor are generally targeting the Marcellus formation, which is significantly further from the basement rocks where the majority of the seismicity is occurring and appears to lower the prevalence of induced seismicity (Skoumal et al. 2018). Likewise, many of the WD wells to the west of the seismicity corridor target shallower formations that would lower the likelihood. So we believe the leading hypothesis for the north-south corridor of seismicity is that the target depth of HF and WD operations in this corridor is closer to basement and leads to higher risk of induced seismicity in this zone.

Finally, we note that most of the sequences with good depth resolution have occurred in Precambrian basement, where preexisting faults are thought to be mature enough to produce M>2 earthquakes. While there is geologic evidence that these faults would be mature based on the ages of these rocks and tectonic history of eastern North America, the low b-values of these deeper sequences correspond to those observed in lab measurements of mature fault surfaces (Goebel et al., 2017; Kozłowska et al. 2018). Recent induced earthquakes in the Appalachian Basin have reached a magnitude of 4.0 and 3.7 for WD and HF, respectively. We anticipate that operational activities could produce larger magnitude earthquakes considering that the magnitude 5.0 earthquake near Perry, OH in 1986 is suspected of being induced by fluid injection and that other earthquakes in North America induced by WD and HF have reached magnitudes of 5.9 and 4.5, respectively.

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Fig. 1. Map showing the location sequences of cataloged (M>~2) seismicity in Ohio and neighboring States from 2010-2017. Blue triangles show sequences induced by WD, red squares – HF, pink squares and cyan triangles show all horizontal and WD wells in the area (Ohio Department of Natural Resources - ODNR 2018c). Circles are earthquakes of probably natural origin. Stars mark earthquakes that may have been induced in the 1980s. Labels are A: Ashtabula, B: Braxton, B-G: Belmont-Guernsey, G: Gilmer, H: Harrison, L: Lake, M: Monroe, N: Noble, N.B: North Beaver, P: Poland, T: Trumbull, W: Washington, Y: Youngstown.

Fig. 2. Number of all cataloged (M>~2) earthquakes per year in Ohio, Pennsylvania, and West Virginia , averaged over the 10 prior years. This includes both natural and induced seismicity.

Fig. 3. Frequency-magnitude distributions of the various seismic sequences induced by WD and HF in the Appalachian Basin. N/Ntot is the number of events at or above a given magnitude divided by the total number of events. The black circles are below the estimated Mc and b-values were calculated using maximum-likelihood estimate. The black line represents maximum-likelihood Gutenberg-Richter fit. Note that several cases (a, c, n, o, p) do not appear to obey log–log power law distribution and several other cases (i-m) are better fit by a truncated Gutenberg-Richter fit (red).

Fig. 4. Examples of clusters of WD induced seismicity. Maps show the location of injection wells (cross) and earthquake locations (circles) for the (a) Youngstown, Ohio, (b) Trumbull Co., Ohio, (c) Washington Co., Ohio, and (d) Braxton Co., West Virginia. In (a-c), the refined double-difference relocations are shown, while in (d) only the catalog locations are available. In (a-b), the circles are scaled according to magnitude. Focal mechanisms are shown when available. The arrows show orientation of maximum horizontal stress, and the gray lines are the fault orientation suggested by focal mechanism and trend of hypocenters.

Fig. 5. Examples of clusters of HF induced seismicity. (a) Map of the Harrison County region showing HF well pads (circles), earthquakes (crosses), and county lines (lines). HF wells and earthquakes are colored if they were associated. Focal mechanisms are shown when available. (b) Enhanced seismicity catalog for the Harrison Co. region. Colors mark cases where earthquakes correlate in space and time with HF wells. Reported/estimated HF times are shown as thin bars across the top. Other maps and timelines are for the (c,d) Poland Twp., OH and Lawrence Co., PA, (e,f) Noble/Belmont/Guernsey Co., and (g,h) Monroe Co. regions.

Fig. 6. Map of Eastern Ohio showing the apparent SHmax direction (arrows) determined using the focal mechanisms and relocated hypocenters from induced seismicity (both recent and the potentially induced older events): red=HF, blue=WD, black=old. Symbols are centered on the epicenter of the largest earthquake in the sequence.

Magnitude (M_L)

N/Ntot

a) b=1.56, N_{tot}=566, Youngstown$_{WD}$

b) b=0.86, N_{tot}=79, Washington$_{WD}$

c) b=1.00, N_{tot}=108, Trumbull$_{WD}$

d) b=0.69, N_{tot}=35, Braxton,WV$_{WD}$

e) b=1.30, N_{tot}=562, Harrison-Davidson$_{HF}$

f) b=0.91, N_{tot}=77, Poland$_{HF}$

g) b=0.71, N_{tot}=400, Monroe$_{HF}$

h) b=0.63, N_{tot}=161, Gilmer,WV$_{HF}$

i) b=0.76, N_{tot}=7224, Harrison-Ryser$_{HF}$

j) b=0.72, N_{tot}=6841, Harrison-Hamilton$_{HF}$

k) b=0.79, N_{tot}=171, Belmont-2014$_{HF}$

l) b=0.74, N_{tot}=61, Belmont-2016$_{HF}$

m) b=1.12, N_{tot}=307, Beaver,PA$_{HF}$

n) b=1.91, N_{tot}=201, Harrison-Vozar$_{HF}$

o) b=1.54, N_{tot}=1539, Harrison-Tarbert$_{HF}$

p) b=0.67, N_{tot}=18, Noble$_{HF}$

a) Month of 2011: 6, 12

b) Depth (km): 3.5, 4.0

c) Days after 7/1/14: 0, 30, 60, 90

d) 2 km

a) Harrison Co.

2 km

b) Magnitude
4
3
2
1
0
2014   2015   2016   2017
Time (y)

c) Poland Twp.
Lawrence Co.

2 km

d) Magnitude
4
3
2
1
0
2014   2015   2016   2017
Time (y)

e) Guernsey Co.
Belmont Co.
Noble Co.

2 km

f) Magnitude
4
3
2
1
0
2014   2015   2016   2017
Time (y)

g) Monroe Co.

2 km

h) Magnitude
4
3
2
1
0
2014   2015   2016   2017
Time (y)