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1 2 3	Carbon dioxide migration along faults at the Illinois Basin – Decatur Project revealed using time shift analysis of seismic monitoring data
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10	Abstract
11	Large scale underground storage of CO_2 is being deployed worldwide to reduce greenhouse gas
12	emissions to the atmosphere. Modelling studies have investigated the possible risks from the
13	CO_2 migrating along faults, but this has not yet been observed. We were able to identify such
14	CO_2 migration at a commercial-scale, demonstration CO_2 storage project, the Illinois Basin -
15	Decatur Project, including subsequent emergence of the CO_2 into overlying permeable layers.
16	Our interpretation resolves previous inconsistencies observed at the project and provides a rare field observation the fluid dynamics of CO_2 moving between faults and reservoir lithology.
17 18	The project had deployed time-lapse 3D vertical seismic profile imaging to study CO_2 plume
10	development, interpreted based on the commonly used amplitude attributes. However, factors
20	including survey repeatability, subtle seismic fluid effects and irregular filling of the storage
21	reservoir by CO_2 meant that amplitude anomalies due to CO_2 were not distinct. Here we apply
22	an alternative interpretation technique to the data based on time shift attributes, resulting in
23	much clearer plume anomalies. This work provides field validations of previously theorised plume
24	behaviours and demonstrates the use of an alternative analysis technique to overcome challenges
25	in interpretation of seismic monitoring data for geological CO_2 storage.

²⁶ Introduction

²⁷ Carbon capture and geological storage is being scaled up worldwide to achieve net zero carbon ²⁸ emissions by 2050 (Krevor et al., 2023; Pörtner et al., 2022). Monitoring CO₂ storage through ²⁹ time-lapse seismic techniques has provided observations of the flow and trapping behaviour of the ³⁰ injected CO₂ at storage projects around the world (Furre et al., 2017; Hansen et al., 2013; Ivandic ³¹ et al., 2015; Roach & White, 2018). The observations have revealed fluid dynamics which are more ³² complex and dynamic than analogous subsurface fluids systems due to the properties of CO₂ as a ³³ supercritical fluid at reservoir conditions (Cavanagh & Haszeldine, 2014; Ringrose et al., 2022).

Of particular interest is the potential for CO_2 to move buoyantly upwards from a target reservoir 34 through leakage pathways such as a fault or wellbore, and this has been investigated using geological 35 analogues, and theoretical and numerical modelling (Gasda et al., 2004; Gilmore et al., 2022; Miocic 36 et al., 2016; Nordbotten et al., 2009). There are no instances of CO₂ leakage from currently operating 37 storage projects. However, CO₂ escape from natural subsurface accumulations is observed primarily 38 through faults, and the escape of hydrocarbon gases through wellbores is pervasive (Dockrill & 39 Shipton, 2010; Faulkner et al., 2010; Jung et al., 2014; Kang et al., 2016; Miocic et al., 2016; 40 Onishi et al., 2019). Models of these systems show that complex dynamics emerge depending on the 41 permeabilities of fault zones relative to reservoir units, and CO₂ migration up leakage pathways can 42 in some instances be entirely mitigated by trapping as the plume emerges in overlying permeable 43 strata. Despite their importance, the hydraulic properties of fault zones are notoriously difficult to 44 evaluate, and there are no engineered settings in which the movement of CO_2 along faults has been 45 observed.

However, while time-lapse seismic surveys provide a means for observation of fluid movement 47 over time, their acquisition and processing must be performed in a way that maximises repeatability 48 (Johnston, 2013). In general, land seismic surveys can suffer from significantly more noise than 49 marine seismic surveys due to scattering by the near surface layer (Stork, 2020). Time-lapse 3D 50 (i.e. 4D) vertical seismic profile (VSP) surveys at the onshore Illinois Basin – Decatur Project CO₂ 51 storage site, the focus of this work, were affected by seasonal variations in ground conditions and 52 source co-location issues due to infrastructure development and permitting difficulties (Couëslan et 53 al., 2013). The project used an interpretation approach for the 4D data that is based on amplitude 54 difference (Couëslan et al., 2014) and normalised RMS amplitude difference attributes (Bauer et al., 55 2019). The results were ambiguous due to weak time-lapse signals (Couëslan et al., 2013). During 56

the post-injection phase, the project detected an isolated finger of CO_2 in the injection well in a shallower zone than the injection interval (Zaluski & Lee, 2021), and the lack of seismic monitoring during that period meant the origins of the CO_2 could not be ascertained.

We used time shift attributes to analyse the seismic monitoring data at Decatur, a technique 60 that has been applied successfully to monitor fluid movement in oil and gas reservoirs (Benguigui 61 et al., 2012; Falahat et al., 2011; Santos et al., 2016) and to support amplitude interpretation at 62 CO₂ storage sites (Arts et al., 2004; Chadwick et al., 2004, 2005; Furre et al., 2015; Grude et al., 63 2013). The results resolve inconsistencies in the previous interpretation, revealing that the CO_2 64 plume at Decatur has been migrating along major faults previously characterised in the reservoir, 65 and moving in response to injection at a neighbouring site. The analysis thus provides an important 66 dataset of previously theorised plume migration behaviour between fault zones and reservoir units. 67 while demonstrating the superiority of a seldom used approach to time-lapse seismic analysis. 68

⁶⁹ Results and Discussion

⁷⁰ Interpretations of CO₂ plume anomalies from seismic monitoring data

We interpret CO_2 plumes qualitatively from the results of time shift analysis, identifying several 71 plume layers, with the largest layer in the injection interval (the lower unit of the Mt. Simon A 72 formation). A second plume layer is identified in the upper unit of the Mt. Simon A formation, and 73 a third and fourth layer in the Mt. Simon C formation. Figure 1 (a) shows a map view of three 74 layers located at different depths as interpreted from the first time-lapse monitor. Figures 1 (b) and 75 (c) show cross sectional views of the plume layers. Also shown are three out of 28 faults interpreted 76 to transect parts of the Mt. Simon formation. These faults were interpreted prior to injection, from 77 3D seismic data acquired during site characterisation. Most of the faults have small displacements 78 relative to the thickness of the Mt. Simon, with the largest vertical displacement estimated to be 79 about 18 m. All interpreted plume anomalies exceed the lateral coverage of the seismic monitoring 80 cubes. This is because the VSP surveys employed have a limited imaging aperture given that the 81 receiver array is located in a well. 82

We check the plume results from our analysis against saturation measurements acquired in the wells. The seismic results show that layers 1 and 3 should be detected in injection well CCS1, but not layer 2 which does not reach the well. Observations from the repeat saturation logs confirm this expectation. However, while monitoring well VW1 shows a detection of an approximately 2 m thick

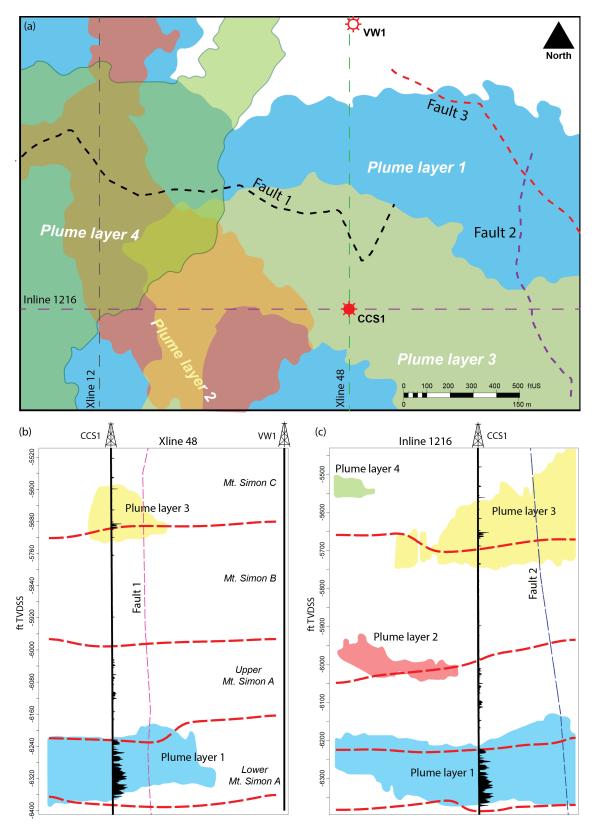


Fig. 1 (a) A map view of interpreted plume layers from time shift analysis at different depths for the first monitor. (b), (c) Cross sections along the inline and crossline marked in (a). CO_2 saturation from well logging measurements at a time corresponding to the first monitor is shown along the well path. Thicknesses of the upper plume layers appear exaggerated due to the low frequency characteristics of the seismic data.

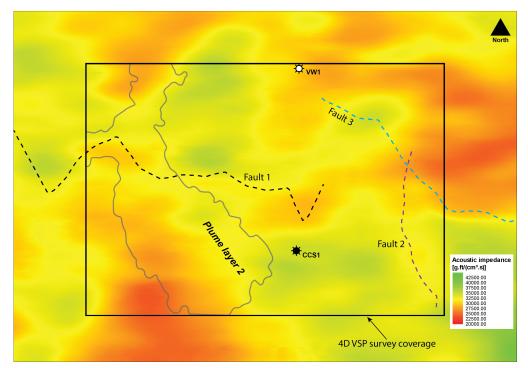


Fig. 2 Reservoir quality represented by acoustic impedance, with low values (red and yellow) corresponding to high quality regions. Slice shown is at 6000 ft TVDSS. CO_2 plume layer 2 interpreted from 4D VSP within the coverage at the corresponding depth appears to track high quality regions of the reservoir.

layer 1 from the saturation log, the interpreted CO_2 plume layer 1 from seismic does not reach the 87 well. Given the resolution of the seismic data at the depth of the injection interval of about 20 m, we 88 do not expect a 2 m thick plume to be resolved or even detected. Moreover, in the third monitor, by 89 which time 730,000 t of CO_2 had been injected and the gross thickness of the plume at VW1 from 90 the saturation logs was about 18 m thick, it is detected from the seismic results. The saturation 91 logs show that the upper plume layers are thin (layer 3 is about 5 m at the location of well CCS1), 92 however, their thicknesses from seismic appear exaggerated due to the low frequency characteristics 93 of the data. The plume features from all monitors are qualitatively very similar as observed within 94 the narrow monitoring cubes. This suggests that the vertical distribution behaviour, including flow 95 through faults, developed quite early, within four months of injection. Therefore, with increasing 96 mass of injected CO_2 over time, we expect the major differences to be in the lateral footprint, which 97 the narrow cubes make impossible to fully observe. 98

The irregular plume shapes produced by the shallower CO_2 layers appear to be controlled by reservoir quality. As shown in Figure 2, the outline of plume layer 2 tracks the high quality regions as the CO_2 avoids the poor quality areas. We use a 3D volume of acoustic impedance, a product of rock bulk density and P-wave velocity, to represent reservoir quality. Zones of high acoustic ¹⁰³ impedance represent low quality or tight zones and vice-versa. The acoustic impedance volume was ¹⁰⁴ derived from inversion of 3D seismic data acquired for site characterisation. Acoustic impedance is ¹⁰⁵ a good proxy for reservoir quality in this case because the primary cause of poor reservoir quality ¹⁰⁶ in the upper units of the Mt. Simon is Quartz cementation (Freiburg et al., 2014), which typically ¹⁰⁷ results in higher P-wave velocities by stiffening the rock frame. Cementation also means porosity ¹⁰⁸ destruction, which raises rock bulk densities.

¹⁰⁹ Capillary and permeability barriers and vertical CO₂ containment

Early modelling attempts at the Decatur site evaluated the risk of extensive lateral migration as 110 low and expected a more vertical filling of the lower Mt. Simon sandstone by the injected CO_2 111 (Finley et al., 2013). This informed the design of the time-lapse VSP surveys used for studying the 112 plume development (Couëslan et al., 2009). From observation of the time-lapse saturation logs, it 113 can be interpreted that contrary to those expectations, the injected CO_2 preferentially fills the high 114 quality reservoir sandstones and avoids poorer quality or tight sandstones (Figure 3). We define tight 115 sandstones as those with low porosity, low permeability and high capillary entry pressure. Strandli 116 and Benson, 2013 and Strandli et al., 2014 show that there is excellent pressure communication 117 between the two zones where the fingers of the plume are detected in VW1 (zones 2 and 3 in Figure 118 3), with both bottomhole pressure gauges showing identical behaviours and near-instantaneous 119 responses to varying injection rates. Nonetheless, the lower finger does not at any point buoyantly 120 rise and coalesce with the upper finger, even after injection had ceased, as it is held back by a tight 121 zone at 6294 ft (Figure 3). The upper finger is also contained by another tight zone at 6251 ft. These 122 tight zones clearly have sufficient permeability to allow good pressure communication across and 123 even allow the flow of displaced brine as shown by Strandli et al., 2014. This suggests that these 124 tight zones are capillary barriers rather than permeability barriers. 125

We however do not discount the presence of permeability barriers in the lower Mt. Simon. One 126 such barrier is a mudstone layer of about 1.8 m thickness at 6182-6186 ft in VW1. Strandli et al., 127 2014 show that this layer restricts pressure propagation between zones 2 and 3 below it and zone 128 4 above it. However, this mudstone layer is discontinuous; it is missing in the injection well and is 129 penetrated by only two out of the four wells at the site. These mudstones have been interpreted by 130 Leetaru and Freiburg, 2014 to be interbedded within the Mt. Simon A formation but having a low 131 preservation potential in an ephemeral fluvial environment. This is evidenced by occasional mudstone 132 clasts observed in core from well VW1, likely the eroded remnants of the original mudstone deposits 133

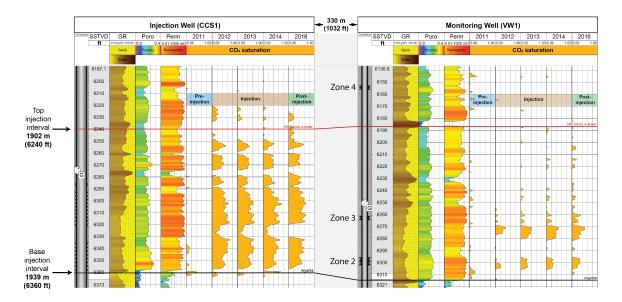


Fig. 3 Well log panels for the injection and monitoring wells showing reservoir properties and repeat saturation logging measurements from pre-injection, through the injection period to post-injection.

(Leetaru & Freiburg, 2014). This is in addition to their complete absence in two wells. Therefore, the general vertical containment of CO_2 within the lower unit of the Mt. Simon A formation (the injection interval) cannot plausibly be attributed to them.

¹³⁷ CO₂ migration along faults locally within the Mt. Simon and subsequent ¹³⁸ emergence

We interpret CO_2 flow along faults within the Mt. Simon, while it remains contained within high 139 quality zones, all below the sealing primary caprock. As shown in Figure 4, the main plume of CO_2 140 in the injection interval is contained within the lower unit of Mt. Simon A. The acoustic impedance 141 slice representing reservoir quality shows the lack of high quality pathways through the rock matrix 142 for CO_2 to migrate upwards from the injection interval. Saturation logs in CCS1 confirm this as 143 they show no continuous CO_2 saturation along the rest of the profile between the detections of layer 144 1 and layer 3 (Figure 3). The origin of the CO_2 detected in the overlying zones, therefore, requires 145 an alternative explanation. We thus interpret that at least the east-west trending fault 1 shown in 146 Figure 1 to be hydraulically conductive and transmitting CO_2 upwards along its apertures under 147 gravity, and feeding the upper plume layers from layer 1. Buoyant CO_2 fluid contained within layer 148 1 preferentially channels upwards along the fault rather than through the overlying capillary barrier. 149 CO_2 entry into the fault implies a lower capillary entry pressure through the fault apertures. We 150 propose that CO_2 flows through the fault and emerges when it reaches a point where the reservoir 151

is of high quality, or a point beyond which the fault zone has lower permeability. This is illustrated
in Figure 4.

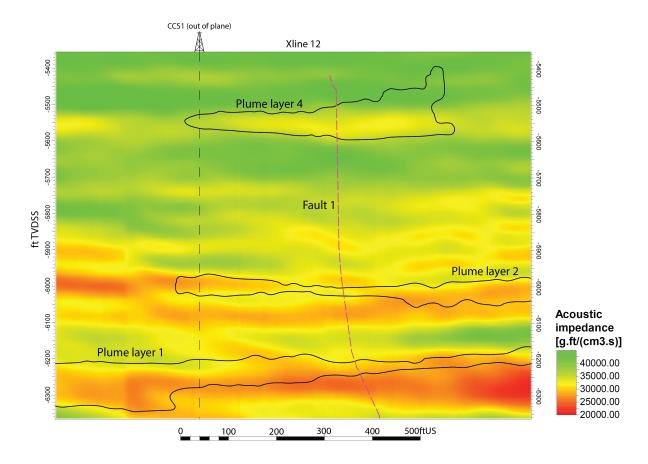


Fig. 4 Acoustic impedance from 3D seismic inversion used as a proxy for reservoir quality. Interpreted plume outlines are shown to be prevented from buoyantly rising by tight zones or capillary barriers (green regions) and instead channel through permeable faults.

We interpret fault 2 and fault 3 (Figure 2) to be non-conductive. This is because we do not detect 154 the emergence of CO_2 around the faults in the high quality zone at the eastern flank of the monitored 155 area. This could be because the faults are kept closed by compressive stresses. The Illinois Basin lies 156 within the east-northeast to west-southwest compressive stress field of the eastern part of the North 157 American plate, with the maximum horizontal stress orientation ranging between N60°E to N80°E 158 (Lahann et al., 2017). This could provide a reasonable explanation as to the non-conductive nature 159 of these faults, which are near perpendicular to the direction of maximum horizontal stress. The 160 generally east-west trending fault 1, conversely, appears conductive and probably solely responsible 161 for feeding the overlying plume layers. The behaviour of CO_2 emergence in a high quality zone 162 could mitigate leakage up conductive faults as the amount of CO_2 that continues to migrate up a 163

fault is progressively reduced with each encountered high quality zone. Where the conductive faults are intra-reservoir and do not traverse the seal, they would merely serve to provide access to other good quality zones of the reservoir, distributing the CO_2 among them, as has been shown through modelling (Yang et al., 2018; Zhang et al., 2024). Such is the case for the Decatur project; the fault provides flow pathways to overlying good quality zones of the Mt. Simon formation, which the injected CO_2 is unable to access normally due to capillary barriers.

¹⁷⁰ Origins of late CO₂ arrival at injection well post-injection

An isolated finger of CO₂ was detected in the injection well during the post-injection period of the project in May 2018. This CO₂ was detected in the upper unit of the Mt. Simon A formation, and it increased in saturation in the March 2019 survey (Figure 5). The saturation logging report (Swager, 2019) suggested the origins of the CO₂ to be the Illinois Industrial Carbon Capture and Storage project located about 1100 m north of well CCS1. The injection well at this secondary project, well CCS2, had been injecting into the upper unit of the Mt. Simon A formation for 13 months at the time of detection.

A simplified mass and volume balance analysis shows it is unlikely that enough CO₂ had been 178 injected in well CCS2 to have reached well CCS1 at the time of detection. We consider flow through 179 only one-third the thickness of the injection zone at a conservative CO_2 saturation of 0.2 and with 180 no dissolution. The resulting plume footprint equivalent to 687,000 t of CO₂ that had been injected 181 at the time is shown in Figure 5 (a). In addition, the uppermost part of the A-Upper unit (c. 5950 182 ft in well CCS2) has the highest reservoir quality throughout the entire Mt. Simon sandstone, with 183 permeabilities up to 1000 mD. Given the excellent correlation of this interval across the three wells, 184 it is the most likely pathway for any rapid migration of CO_2 . However, the late arriving CO_2 was 185 detected instead in an interval in the lower half of the unit at a depth of 6150 ft. This interval 186 is deeper than the injection zone in CCS2, which would require the CO_2 to flow downdip. This 187 is unlikely outside the viscous region due to buoyancy forces. Moreover, no CO_2 was detected in 188 the corresponding interval of well VW1, which is located between wells CCS2 and CCS1. This is 189 summarised in Figure 5 (b). 190

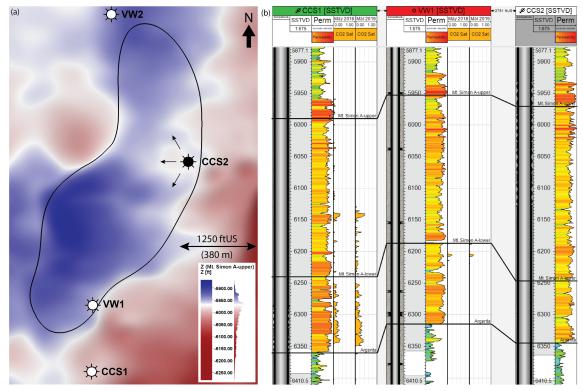
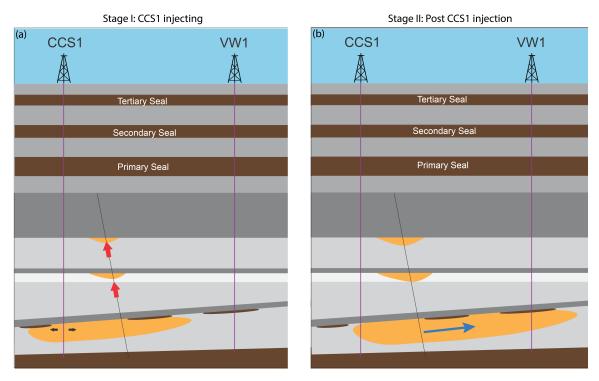


Fig. 5 (a) CO_2 plume footprint equivalent to 687,000 t of CO_2 derived using a simplified mass and volume balance. (b) Well correlation panel showing wells CCS1, CCS2 and VW1 with no CO_2 detection at VW1.

We present an alternative hypothesis based on plume interpretations from seismic time shift 191 analysis and pressure and saturation logging data. We propose that the CO₂ instead originated from 192 the CCS1 well – the same well it was detected in – but from layer 1 in the underlying injection 193 interval. The evidence supports that the CO_2 travelled vertically through Fault 2, forming layer 2 194 as shown in Figure 1. Over time, layer 2 got larger as more CO₂ pooled. Once injection began at 195 the nearby Illinois Industrial Carbon Capture and Storage project, the pressure gradient induced 196 as a result of active CO_2 injection in well CCS2 then forces layer 2 to flow across the face of 197 CCS1, resulting in this new detection. We argue this given that bottomhole pressure data shows 198 good pressure communication between wells CCS1 and CCS2. Our interpretation of the overall 199 CO_2 migration behaviour during the three stages of CCS1 injection, post CCS1 injection and CCS2 200 injection is summarised in Figure 6. 201



Stage III: CCS2 injecting

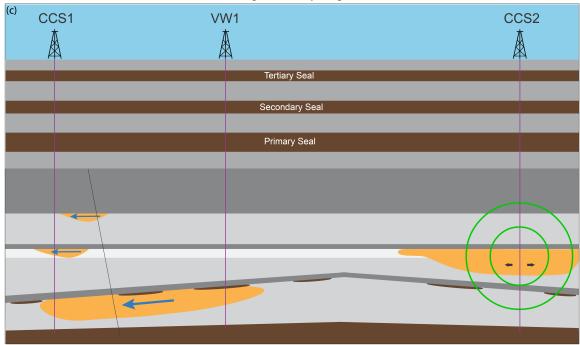


Fig. 6 A conceptual schematic summarising the overall plume behaviour during (a) CCS injection, (b) post CCS1 injection, and (c) CCS2 injection. Reservoir quality is indicated in grayscale with darker tones representing tight zones.

202 Conclusion

We have re-interpreted data from seismic surveys at the Illinois Decatur Basin Project and shown 203 that the CO_2 plume has been migrating along major faults between high quality units of the 204 reservoir, and moving laterally in response to injection at a neighbouring site. The analysis pro-205 vides an important dataset of previously theorised plume migration behaviour between fault zones 206 and reservoir units. This interpretation was otherwise not possible using a conventional analysis 207 of amplitude attributes. Survey repeatability issues including source point co-location difficulties 208 and changing ground conditions introduced spurious amplitude anomalies that subtle fluid-related 209 amplitude anomalies were indistinguishable from. Furthermore, although the lower Mt. Simon reser-210 voir is thick, the CO_2 plume does not fill it uniformly and instead forms thin layers that are not fully 211 resolvable by the seismic data which therefore suffers from tuning of amplitudes. These factors may 212 occur commonly in projects and are unfavourable to an amplitude-based interpretation, especially in 213 onshore settings. The much clearer picture of CO₂ plume anomalies provided by time shifts enabled 214 the overall analysis by allowing a meaningful integration of multiple independent measurements to 215 produce a coherent interpretation of the migration behaviour of injected CO_2 at the Decatur site. 216 We were able to identify an interplay of capillary heterogeneity and upward flow of CO_2 along per-217 meable faults under buoyancy forces. In addition, we identify the role of pressure gradients resulting 218 from CO_2 injection at a neighbouring project in causing the re-mobilisation and flow of CO_2 at the 219 Decatur project post-injection. These behaviours and their impacts have been previously theorised 220 and the observations provided from an industry scale geological CO_2 storage site provides important 22 validation of these theories and data from which future projects may be designed. 222

223 Methods

²²⁴ Monitoring Data from the Illinois Basin - Decatur Project

The Illinois Basin - Decatur Project injected 1 Mt of CO₂ over three years from 2011 to 2014, into the Mt. Simon sandstone at a depth of c. 2100 m. The Mt. Simon sandstone is a Cambrian-age saline aquifer and is one of the major CO₂ sequestration resources in the United States. It is over 450 m thick at the Decatur site. Leetaru and Freiburg, 2014 and Freiburg et al., 2014 provide a detailed depositional and diagenetic characterisation of it at Decatur. It is unconformably overlain by the Eau Claire Formation, which is a predominantly shale formation over 90 m thick at the Decatur site and serves as the primary caprock for the storage unit. The Mt. Simon Sandstone is

subdivided into upper, middle and lower formations. The best reservoir quality occurs in the lower 232 Mt. Simon formation, with porosities of up to 28% and permeabilities of up to 1000 mD, and an 233 average porosity and permeability of 22% and 200 mD. The lower unit of this formation is the 234 injection interval for the project. The project has an injection well (CCS1) and a monitoring well 235 (VW1). Wells CCS2, VW2 are the injection and monitoring wells for the nearby Illinois Industrial 236 Carbon Capture and Storage project. The monitoring data and the data previously acquired for 237 site characterisation form an excellent dataset for studying the complex behaviour of CO_2 plumes 238 in the field. The dataset comprises in-well and geophysical monitoring data including time-lapse 3D 239 VSP surveys. The in-well monitoring data includes bottomhole pressures, injection rates and repeat 240 saturation logs. These logs recorded CO_2 saturation profiles periodically in wells CCS1 and VW1. 241 They provide a time-lapse 1D profile of CO_2 saturation at the high resolution of wireline logging 242 tools. Time-lapse 3D VSP surveying was chosen as the main geophysical monitoring technique to 243 monitor the CO₂ plume in three dimensions. These surveys were meant to provide information on 244 the plume development over time. They were acquired using surface seismic sources with receivers 245 permanently installed in a shallow geophysical monitoring well GM1 located 60 m northwest of 246 the injection well. Surveys were acquired each year from 2012 to 2015, with Baseline 2 being the 247 reference pre-injection survey. Analysis of the time-lapse vertical seismic profile data is the main 248 focus of this work. The survey dates, ground conditions during acquisition and injected CO_2 mass 249 are reported by Couëslan et al., 2013. 250

²⁵¹ Amplitude and time shift attributes

Previous investigations used amplitude attributes including normalised RMS (NRMS) and ampli-252 tude difference (Bauer et al., 2019; Couëslan et al., 2013). We reproduce those analyses by extracting 253 both amplitude difference and NRMS. The attributes do not produce distinct CO₂ plume features 254 as there is a pervasive presence of amplitude anomalies including above the primary seal and below 255 the reservoir in the pre-Cambrian basement. We perform an analysis of time shifts in an attempt to 256 overcome these difficulties in interpretation. Time shifts provide a measure of changes in the two-257 way travel time of a seismic wave between two surveys, where an increase in travel time results from 258 a slowdown of seismic waves by a lower velocity layer and vice-versa. These time shifts are induced 259 as a result of changes in fluid content or stress leading to compaction or extension in the reservoir or 260 the overburden. Landrø and Stammeijer, 2004 define the relative change in elastic wave travel time 261 due to changes in subsurface layer thicknesses (physical strain) and velocity as $\frac{\Delta t}{t} = \frac{\Delta z}{z} - \frac{\Delta v}{v}$, where 262

 $\frac{\Delta t}{t}$ is the relative time shift or time strain, $\frac{\Delta z}{z}$ is the vertical physical strain, and $\frac{\Delta v}{v}$ is the relative 263 velocity change, which is a function of the lithology of the rock and the magnitude of the saturation 264 change. For small physical strains, the time strain approximates to $\frac{\Delta t}{t} = -\frac{\Delta v}{v}$. Time shifts were 265 extracted from full stacks of each of the four 3D monitor surveys relative to the baseline survey. 266 MacBeth et al., 2020 provide a review of various methods of measurement of post-stack time-lapse 267 time shifts. Dynamic time warping (DTW) algorithm with strain constraints as implemented by 268 Hale, 2013 was used to extract the time shifts in this study. It is based on the minimization of the 269 dissimilarity error between two traces: $e[i,q] = (f[i] - g[i+l])^2$, where i is the sample index, l is 270 the integer lag or time shift between seismic traces, and f and g are the seismic amplitudes of the 271 baseline and monitor traces, respectively. 272

The DTW implementation employed imposes constraints on the rate at which shifts may vary in 273 time, i.e., a limit on maximum time strain, and this informs the choice of this algorithm. As relative 274 velocity change can be approximated to the negative of time strain for small physical strains, we can 275 derive from rock physics modelling the maximum saturation change (from available saturation logs), 276 which is then used to model the maximum change in rock velocity. This provides constraints on 277 the time strain. The rock physics modelling performed involved Gassmann (Gassmann, 1951) fluid 278 substitution of brine with CO_2 following a patchy mixing (Brie et al., 1995). The mixing type was 279 informed by field observations of velocity-saturation relationships for CO₂ storage in saline aquifers 280 (Caspari et al., 2011). Fluid properties at in-situ conditions were computed using the FLAG fluid 281 calculator (Han & Batzle, 2014). Constraints on time shifts and relative velocity change can also be 282 derived from analogue datasets such as those published in MacBeth et al., 2019. These constraints 283 are crucial for the accuracy of the results. Therefore, the atypical availability of the repeat CO_2 28 saturation logs in this dataset was essential to the successful application of this approach. 285

²⁸⁶ Results post-processing and noise removal

The obtained time strain volumes were afflicted by noise and artefacts. Most notably, speedup anomalies were observed directly beneath the slowdown anomalies. Such artefacts can result from data acquisition and processing, and from errors induced in the implementation of the time shift algorithms (MacBeth & Izadian, 2023). We removed speedup anomalies $(\frac{\Delta v}{v} > 0)$ from the volumes as these are normally not expected when CO₂ replaces brine in a reservoir. Nevertheless, residual random noise was observed. These are attributed mainly to data acquisition challenges of source point co-location and varying ground conditions which may have introduced spurious time shifts in

addition to amplitude anomalies throughout the volumes. A noise removal algorithm was developed 294 to remove the residual noise from the time strain volumes. This relies on the availability of multiple 295 monitor surveys. It tracks and preserves any features that are consistent across all the monitors, 296 while discarding any non-consistent features. The design of this filter is based on an assumption that 297 real plume anomalies would be consistent across the surveys while random noise would not. This is 298 supported by the observed CO_2 plume distributions at well locations which remain largely the same 299 over the injection period. Points of consistency in anomalies across all the monitors are identified as 300 seed points, and the noise filter is applied, where the anomalies grow laterally and upwards starting 301 from those seed points. This algorithm is based on the image segmentation algorithm of Flood Fill, 302 and in this case effectively mimics the actual growth of the plume. 303

304 Data availability

The original dataset used in this study was made publicly available by the National Energy Technology Laboratory through the Energy Data eXchange, available at https://doi.org/10.18141/ 1854142.

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