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1	Carbon dioxide migration along faults at the Illinois Basin – Decatur Project
2	revealed using time shift analysis of seismic monitoring data
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6 7 8 9	<sup>1</sup> Department of Earth Science and Engineering, Imperial College London, Royal School of Mines, London, SW7 2BP, United Kingdom. Key Points:
10 11	• 4D seismic time shift attributes reveal previously unidentified CO <sub>2</sub> migration be- haviour where traditional amplitude attributes could not.
12 13 14 15	• The CO <sub>2</sub> migrates from the injection interval, upwards along a permeable fault and re-emerges in overlying permeable reservoir units.
10 17 18 19	• This behavior has been previously theorized but not yet directly observed from a CO <sub>2</sub> storage site.

### 20 Abstract

Large scale geological storage of CO<sub>2</sub> is being deployed worldwide to reduce 21 greenhouse gas emissions to the atmosphere. Previous modelling studies have 22 investigated the potential for CO<sub>2</sub> migration along faults. We observe such migration 23 at a commercial-scale, demonstration CO<sub>2</sub> storage project, including subsequent 24 emergence of the CO<sub>2</sub> into overlying permeable layers. Previous attempts at 25 interpreting the time-lapse seismic data using amplitude attributes were hindered by 26 noise from the limited survey repeatability combined with a weak signal due to the 27 stiffness of the rock. Here we apply an alternative interpretation of the seismic data 28 using time shift attributes, resulting in clear plume anomalies. In addition to migrating 29 up the fault, we observe the plume diverted by the start of injection at a neighboring 30 project. This work provides field observations of theorized plume behaviors and 31 demonstrates an approach to overcome challenges in interpreting seismic monitoring 32 data for geological CO<sub>2</sub> storage. 33

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#### 1 Introduction 36

Carbon capture and geological storage is being scaled up worldwide to achieve net 37 zero carbon emissions by 2050 (Krevor et al., 2023; Pörtner et al., 2022). Monitoring CO<sub>2</sub> 38 storage through time-lapse seismic techniques has provided observations of the flow 39 and trapping behavior of the injected CO<sub>2</sub> at storage projects around the world (Furre 40 et al., 2017; Hansen et al., 2013; Ivandic et al., 2015; Roach & White, 2018). The 41 observations have revealed fluid dynamics which are more complex and dynamic than 42 analogous subsurface fluids systems due to the properties of CO<sub>2</sub> as a supercritical 43 fluid at reservoir conditions (Cavanagh & Haszeldine, 2014; Ringrose et al., 2022). 44

Of particular interest is the potential for CO<sub>2</sub> to move buoyantly upwards from a 45 target reservoir through leakage pathways such as a fault or wellbore. This has been 46 investigated using geological analogues, and theoretical and numerical modelling 47 48 (Gasda et al., 2004; Gilmore et al., 2022; Miocic et al., 2016; Nordbotten et al., 2009, Flemisch et al., 2024). Models show that complex dynamics emerge depending on the 49 permeabilities of fault zones relative to reservoir units, and CO<sub>2</sub> migration up leakage 50 pathways can in some instances be entirely mitigated by trapping as the plume emerges 51 in overlying permeable strata. 52

Despite their importance, there are no engineered settings in which the movement 53 of CO<sub>2</sub> along faults has been observed. CO<sub>2</sub> escape from natural subsurface 54 accumulations has been inferred to occur through faults based on geochemical and 55 isotope measurements of carbonate deposits and travertine veins (Shipton et al., 2004; 56 Dockrill and Shipton; 2010; Kampman et al., 2012; Jung et al., 2014; Miocic et al., 57 Natural hydrocarbon gas leakage has also been inferred from seismic 2018). 58 observations of gas chimneys and associated pockmark clusters on the seafloor (e.g. 59 Gay et al., 2007; Roelofse et al., 2020). 60

Time-lapse seismic surveys are the industry standard for monitoring the plume 61 dynamics, however, their acquisition and processing must be performed in a way that 62 maximizes repeatability, which can be affected by factors such as seasonal variations and 63 differences in acquisition geometry (Landro, 1999; Lumley, 2001; Johnston, 2013; 64 Meunier et al., 2001; Bakulin et al., 2007). In addition, in general, land seismic surveys 65 can suffer from significantly more noise than marine seismic surveys due to scattering 66 by the near surface layer (Pevzner et al., 2011; Stork, 2020). In this paper, we find 67 evidence of CO<sub>2</sub> migration up faults during injection at the onshore Illinois Basin -68 Decatur Project CO<sub>2</sub> storage site using time shift analysis of time-lapse 3D (i.e. 4D) 69 vertical seismic profile (VSP) surveys. The initial interpretation approach for the 4D 70 data was based on amplitude difference (Coueslan et al., 2014) and normalized RMS 71 attributes (Bauer et al., 2019), but observations of the CO<sub>2</sub> plume were ambiguous due 72 to weak time-lapse signals (Coueslan et al., 2013). During the post-injection phase, 73 well logs detected an isolated finger of CO<sub>2</sub> in the injection well in a shallower zone 74 than the injection interval (Zaluski & Lee, 2021) but the lack of seismic monitoring 75 during that period meant the origins of the CO<sub>2</sub> could not be ascertained. The 76 application of an amplitude agnostic, time shift analysis, reported here, reveals clear, 77 qualitative images of a growing CO<sub>2</sub> plume in this interval that has arrived by migration 78 up a previously identified fault. 79

80 **2** Methods

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#### 2.1 The Illinois Basin - Decatur Project

The Illinois Basin - Decatur Project (IBDP) was a commercial-scale demonstration CO<sub>2</sub> sequestration project in Decatur, Illinois, USA, which stored 1 Mt of CO<sub>2</sub> over three years from 2011 to 2014. The projected injected the CO<sub>2</sub> into the Mt. Simon Sandstone at a depth of about 2100 m. The project has an injection well 86 (CCS1) and a monitoring well (VW1). Wells CCS2, VW2 are the injection and 87 monitoring wells for a nearby secondary commercial project, the Illinois Industrial 88 Carbon Capture and Storage (IL-ICCS) project. The monitoring and site 89 characterization data from both projects have been made publicly available and 90 provide a comprehensive dataset suitable for studying the complex behavior of CO<sub>2</sub> 91 plumes in the field.

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# 2.2 Geologic setting

The Mt. Simon sandstone is a Cambrian-age saline aquifer and is one of the major 93 CO<sub>2</sub> sequestration resources in the United States. It is over 450 m thick at the Decatur 94 site. Leetaru and Freiburg (2014) and Freiburg et al. (2014) provide a detailed 95 depositional and diagenetic characterization of the Mt. Simon sandstone at Decatur. It 96 is unconformably overlain by the Eau Claire Formation, which is a predominantly shale 97 98 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 99 Lower units. 100

The most significant controls on reservoir quality in the Mt. Simon sandstone are 101 diagenetic, with quartz cementation the most common feature. The Middle Mt. Simon 102 103 is commonly referred to as the tight zone, comprising Mt. Simon C and D, with unit D having the most quartz cement in the entire Mt. Simon sandstone. The best reservoir 104 quality occurs in the lower Mt. Simon formation, comprising units A and B, with 105 porosities of up to 28% and permeabilities of up to 1000 mD in Unit A, and an average 106 porosity and permeability of 22% and 200 mD. Within this unit, there is significant 107 variation is reservoir quality as shown by the well logs. Unit A is the injection interval 108 109 for the project. Several faults were interpreted by Williams-Stroud et al. (2020) to transect the middle and lower units of the Mt. Simon sandstone with some of them 110

extending down into the Precambrian basement. Williams-Stroud et al. (2020)
interpret the fault lengths to range from approximately 250 m to 1000 m, and that some
of them may comprise multiple intersecting fault planes or smaller faults.

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## 2.3 Monitoring data

The monitoring dataset at the IBDP site comprises in-well and geophysical 115 monitoring data including time-lapse 3D VSP surveys. Repeat saturation logs recorded 116 CO<sub>2</sub> saturation profiles periodically in wells CCS1 and VW1. Time-lapse 3D VSP 117 118 surveying was chosen as the main geophysical monitoring technique to observe the CO<sub>2</sub> plume development over time. The surveys were acquired using surface vibrator 119 sources with 3-component geophones permanently installed in a shallow geophysical 120 monitoring well GM1 located 60 m northwest of the injection well. A monitor survey 121 was acquired each year from 2012 to 2015 (M1-M4), with a baseline survey acquired 122 in 2011 (B2) being the reference pre-injection survey. At the time of M1, M2, M3 and 123 M4 surveys, 74 kt, 433 kt, 730 kt and 1 Mt of CO<sub>2</sub> had been injected, respectively. 124 Analysis of the time-lapse vertical seismic profile data is the main focus of this work. 125 The survey dates, near-surface conditions during acquisition and injected CO<sub>2</sub> mass are 126 reported by Coueslan et al. (2013) and provided in the Supplementary Information. 127

128 The main processing steps performed for the 4D VSP data prior to its public release include de-noise and amplitude scaling, wavefield separation, deconvolution and pre-129 stack depth migration. These processing steps were carried out for each monitor 130 alongside the baseline (B2), ensuring the extraction of co-located sources (given 131 differences in source locations for the different surveys) and matching geometries. 132 Details of the time-lapse co-processing are provided in the time-lapse 3D VSP 133 processing reports (Schlumberger, 2015). We use the migrated stacks as inputs to our 134 analysis. 135

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### 2.4 Time shift attribute extraction

Previous investigations at the IBDP used amplitude attributes including NRMS 137 and amplitude difference. Coueslan et al. (2013) presented NRMS over a zone 138 containing the injection interval (1980 m - 2195 m) and a shallow zone (1524 m -139 1980 m) covering the Middle and Upper Mt. Simon and the Eau Claire Shale primary 140 seal. While the strongest NRMS anomalies are in the deeper zone, there are still 141 anomalies in the shallow zone. They also show an amplitude difference section where 142 differences can be observed outside the injection interval window (Figure 6 in 143 Coueslan et al. (2013)). This leaves questions particularly about the finer-scale fluid 144 movement within the entire Mt. Simon sandstone. An amplitude-based interpretation 145 146 is insufficient to answer these questions. We performed an analysis of time shifts in an attempt to overcome these difficulties in interpretation. 147

Time shift attributes of 4D seismic data have been used successfully to monitor 148 fluid movement in oil and gas reservoirs (Benguigui et al., 2012; Falahat et al., 2011; 149 Santos et al., 2016) and to support amplitude interpretation at CO<sub>2</sub> storage sites (Arts 150 et al., 2004; Chadwick et al., 2004, 2005; Furre et al., 2015; Grude et al., 2013). Time 151 shifts are induced as a result of changes in fluid content or stress leading to 152 compaction or extension in the reservoir or the overburden. Landrø and Stammeijer 153 (2004) define the relative change in elastic wave travel time due to changes in 154 subsurface layer thicknesses (physical strain) and velocity as  $\frac{\Delta t}{t} = \frac{\Delta z}{z} - \frac{\Delta v}{v}$ , where  $\frac{\Delta t}{t}$  is 155 the relative time shift or time strain,  $\frac{\Delta z}{z}$  is the vertical physical strain, and  $\frac{\Delta v}{v}$  is the 156 relative velocity change, which is a function of the rock physics properties of the rock 157 and the magnitude of the saturation change. MacBeth et al. (2020) provide a review 158 of various time shift estimation algorithms, from the commonly used and simpler 159 cross-correlation based methods to sophisticated waveform inversion approaches. 160

We implement a time shift algorithm based on the Dynamic Time Warping 161 (DTW) algorithm of Hale (2013), modified to avoid dependency on amplitudes. Our 162 implementation is based on matching features – peaks and troughs – between seismic 163 traces from the baseline and monitor surveys. DTW instead attempts to match 164 165 amplitudes between seismic traces, which in our case we expect to change between baseline and monitor even where there is no CO<sub>2</sub> present, due to the fluid effect being 166 so subtle. The application of DTW under these circumstances therefore leads to noise. 167 We tested this approach through synthetic modelling; we produced 1D (pseudo-2D) 168 synthetic models based on well logs in well CCS1 (see the Supplementary 169 Information) and used the repeat saturation logs to produce monitor synthetics under 170 fully patchy and fully uniform mixing conditions. 171

The feature-based warping approach operates in a similar way to the standard DTW algorithm which is based on the minimizing the dissimilarity error between two traces:

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$$e[i,q] = (f[i] - g[i+l]),$$
 (1)

where i is the sample index, l is the integer lag or time shift between seismic traces, and f and g are the seismic amplitudes of the baseline and monitor traces, respectively.

However, in our feature-based implementation, the objective is to align features
(peaks and troughs) between two seismic traces by minimizing the geometric
dissimilarity between these features. The dissimilarity error is defined as:

181 
$$e_{feature}[i,q] = d(f_{feature}[i],g_{feature}[i+l])$$
(2)

182 where  $f_{feature}[i]$  and  $g_{feature}[i+l]$  are the positions of key features in the baseline 183 and monitor traces, respectively, and  $d(f_{feature}[i], g_{feature}[i+l])$  is a measure of 184 the distance between the features in the two traces, in this case the L1 or Manhattan

distance. The cost matrix is filled in using the distances between the corresponding 185 features in the baseline and monitor traces. The warping path is then optimized to 186 minimize the cumulative feature distance along the path. Therefore, the warping is 187 guided entirely by the spatial relationships between key features in the traces, without 188 any consideration of the amplitudes of these features. Our synthetic modelling shows 189 that we can detect  $CO_2$  through feature-based warping for a 5 m thick layer at  $CO_2$ 190 saturation as low as 10% under uniform saturation, and for thicker layers under fully 191 patchy saturation (see Supplementary Information). Our synthetic modelling also, 192 however, reveals that the apparent thickness of CO<sub>2</sub> one would recover from seismic 193 data is much thicker than the true thickness. This is expected given the low-frequency 194 nature of seismic data. 195

Time shifts were extracted from full stacks of each of the four 3D monitor surveys relative to the B2 baseline survey. We extract time shifts starting from 870 ms (or about 1500 m), because data folds are minimum in the shallow interval due to VSP geometry constraints. The time-lapse 3D VSP processing report notes that data shallower than 1500 m was not used to compute time-lapse attributes for the same reason (Schlumberger, 2015). We obtain time strain by taking the first derivative of the time shift volumes.

#### **3** Results and Discussion 203

#### 3.1 CO<sub>2</sub> plume interpretation from relative velocity change 204

We interpret CO<sub>2</sub> plumes qualitatively from the results of time strain, identifying 205 multiple plume layers, with the feature having the greatest areal extent being in the 206 207 deepest in the injection interval (the lower unit of the Mt. Simon A formation). Figure 1 shows views of the plume features in the shallowest interval for all four monitors. 208 These features are generally consistent across time from 2012 to 2015. We interpret 209 the regions of relative velocity change < -0.02 to be areas of CO<sub>2</sub> accumulation. Also 210 shown are four out of several faults interpreted by Williams-Stroud et al. (2020). These 211 faults were interpreted prior to injection, from 3D surface seismic data acquired during 212 site characterization. Some of the interpreted plume anomalies exceed the lateral 213 coverage of the 3D VSP cubes. 214



### -0.1 -0.2 -0.3

Relative Velocity Change 215 216 Figure 1. Map views of relative velocity change showing the shallowest layer (at about 1550 m) 217 from all four monitors (M1-M4) relative to the baseline (B2). Note the excellent consistency in the 218 features.

The similarity and consistency in the geometry of the plume features across the monitors suggests that the vertical distribution behavior developed quite early, within four months of injection (the time of the first monitor). Therefore, with increasing mass of injected  $CO_2$  over time, we expect any major growth of the plumes to be lateral, which the narrow seismic cubes make impossible to fully observe.

Although we do not attempt to invert for  $CO_2$  saturation given uncertainty in the fluid mixing type, we note that our ranges of relative velocity change can be higher in terms of absolute values than the maximum expected from fluid substitution modelling. This is attributed to data quality leading to errors in the time shift estimation. Because time strain and therefore relative velocity change is a derivative of time shift, even a small error in time shift will magnify when converted to relative velocity change (Macbeth and Izadian, 2023).

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### 3.2 Capillary barriers and fault zone migration of CO2 within the Mt. Simon

We interpret fault zone migration of  $CO_2$  in the Mt. Simon sandstone. We infer such migration form areas of multiple plume features separated by low reservoir quality zones, with the plume features intersected by a fault. Figure 2 (a) shows such a scenario in the south-eastern corner of the cube. All three shallower layers appear to have emerged through Fault 2 from the injection interval. We interpret that  $CO_2$  from the injection interval preferentially flows upwards under buoyancy through the fault zone and emerges at shallower intervals.





Figure 2. (a) A 3D view of relative velocity change for M4 relative to B2. Our interpretation is that
regions where the relative change in velocity is < - 0.02 are regions of CO2 saturation. Also shown</li>
are three out of several faults interpreted by Williams-Stroud et al. (2020). Here we identify four
layers or zones with CO2 accumulations. (b) Map views of the four identified layers of CO2 from
Layer 1 to 4.

The vertical and lateral distributions of the plumes appear to be controlled by 245 reservoir quality. We validate this by comparing observations of saturation 246 distribution and reservoir quality in the wells and in seismic data. As shown in Figure 247 3, well log panels for the injection and monitoring wells show the variation in reservoir 248 249 quality across the Mt. Simon. Repeat saturation logging measurements are shown from each year across the CCS1 injection period through to post-injection and to the CCS2 250 injection period. From observation of the time-lapse saturation logs, it can be interpreted 251 that the injected CO<sub>2</sub> preferentially fills the high-quality reservoir sandstones and avoids 252 poorer quality or tight sandstones (Figure 3 (a)). We define tight sandstones as those 253 with low porosity, low permeability and high capillary entry pressure. 254

Early modelling attempts at the Decatur site evaluated the risk of extensive lateral 255 migration as low and expected a more vertical filling of the lower Mt. Simon 256 sandstone by the injected CO<sub>2</sub> (Finley et al., 2013). This informed the design of the time-257 lapse VSP surveys used for studying the plume development (Coueslan et al., 2009). 258 Strandli and Benson (2013) and Strandli et al. (2014) show that there is excellent 259 pressure communication between the two zones where the fingers of the plume are 260 detected in VW1 (zones 2 and 3 in Figure 3 (a)), with both bottomhole pressure gauges 261 showing identical behaviors and near-instantaneous responses to varying injection rates. 262 Nonetheless, the lower finger does not at any point buoyantly rise and coalesce with the 263 upper finger, even after injection had ceased, as it is held back by a tight zone at 1920 264 m (Figure 3 (a)). The upper finger is also contained by another tight zone at 1905 m. 265 266 These tight zones clearly have sufficient permeability to allow good pressure communication across and even allow the flow of displaced brine as shown by Strandli 267 et al. (2014). This suggests that these tight zones are capillary barriers rather than 268 permeability barriers. 269



Figure 3. (a) Well log panels for the injection and monitoring wells showing the variation in reservoir quality across the Mt. Simon in terms of shaliness, porosity and permeability. Repeat saturation logging measurements are shown form each year across the CCS1 injection period through to post-injection and to the CCS2 injection period. Perforated zones are shown in red. Pressure monitoring zones are numbered. (b) Reservoir quality represented by acoustic impedance in 3D, with low quality zones rendered transparent.

Away from the wells, we use a 3D volume of acoustic impedance, a product of rock bulk density and P-wave velocity, to represent reservoir quality. The acoustic impedance 3D volume was released as part of the IBDP dataset. Zones of high

acoustic impedance represent low quality or tight zones and vice-versa. The acoustic 280 impedance volume was derived from inversion of 3D seismic data acquired for site 281 characterization. Acoustic impedance is a good proxy for reservoir quality in this case 282 because the primary cause of poor reservoir quality in the Mt. Simon is quartz 283 284 cementation (Freiburg et al., 2014), which typically results in higher P-wave velocities by stiffening the rock frame. Cementation also means porosity destruction, which raises 285 286 rock bulk densities. The acoustic impedance volume shown in Figure 3 (b) shows the absence of high-quality pathways through the rock matrix for CO<sub>2</sub> to migrate upwards 287 288 from the injection interval.

The behavior of CO<sub>2</sub> emergence in a high-quality zone could mitigate leakage up 289 conductive faults as the amount of CO<sub>2</sub> that continues to migrate up a fault is 290 progressively reduced with each encountered high-quality zone. Where the 291 conductive faults are intra-reservoir and do not traverse the seal, they would merely 292 serve to provide access to other good quality zones of the reservoir, distributing the 293 CO<sub>2</sub> among them, as has been shown through modelling (Yang et al., 2018; Zhang et 294 al., 2024). Such is the case at Decatur; the fault provides flow pathways to overlying 295 good quality zone and stringers in the Mt. Simon formation, which the injected CO<sub>2</sub> is 296 unable to access normally due to capillary barriers. 297

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# **3.3 Origins of late CO2 arrival at injection well post-injection**

An isolated finger of  $CO_2$  was detected in the injection well during the postinjection period of the project in May 2018. This  $CO_2$  was detected in the upper unit of the Mt. Simon A formation, and it increased in saturation in the March 2019 survey (Figure 3(a)). The saturation logging report (Swager, 2019) suggested the origins of the  $CO_2$  to be the Illinois Industrial Carbon Capture and Storage (IL-ICCS) 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 305 13 months at the time of detection. A simplified mass and volume balance analysis 306 shows it is unlikely that enough CO<sub>2</sub> had been injected in well CCS2 to have reached 307 well CCS1 at the time of detection. In addition, the uppermost part of the A-Upper 308 309 unit (c. 1814 m in well CCS2) has the highest reservoir quality throughout the entire Mt. Simon sandstone, with permeabilities up to 1000 mD. Given the excellent 310 correlation of this interval across the three wells, it is the most likely pathway for any 311 rapid migration of CO<sub>2</sub>. However, the late-arriving CO<sub>2</sub> was detected instead in an 312 interval in the lower half of the unit at a depth of 1875 m. This interval is deeper than 313 the injection zone in CCS2, which would require the  $CO_2$  to flow downdip. This is 314 unlikely outside the viscous region due to buoyancy forces. Moreover, no CO<sub>2</sub> was 315 detected in the corresponding interval of well VW1, which is located between wells 316 CCS2 and CCS1. Figure S.4 in the Supplementary Information summarizes this 317 analysis. 318

We present an alternative hypothesis based on plume interpretations from 4D 319 seismic time shift analysis and pressure and saturation logging data. We propose that 320 the CO<sub>2</sub> instead originated from the CCS1 well – the same well it was detected in – 321 but from layer 1 in the underlying injection interval. The evidence supports that the 322 CO<sub>2</sub> travelled vertically through Fault 2, forming layer 2 (Figure 2 (c)). Over time, 323 layer 2 got larger as more CO<sub>2</sub> pooled. Once injection began at the nearby IL-ICCS 324 project, the pressure gradient induced as a result of active CO<sub>2</sub> injection in well CCS2 325 then forces layer 2 to flow across the face of CCS1, resulting in this new detection. 326 We argue this given that bottomhole pressure data shows good pressure 327 communication between wells CCS1 and CCS2. Our interpretation of the overall CO<sub>2</sub> 328 migration behavior during the three stages of CCS1 injection, post CCS1 injection and 329





Figure 4. A conceptual schematic summarizing the overall plume behavior during (a) CCS injection,
(b) post CCS1 injection, and (c) CCS2 injection. Reservoir quality is indicated in grayscale with darker
tones representing tight zones.

# 4 Conclusion

We have re-interpreted data from time-lapse seismic surveys at the Illinois Basin -336 Decatur Project and shown that the CO<sub>2</sub> plume had been migrating along major faults 337 338 between high quality units of the reservoir and moving laterally in response to injection at a neighboring site. The analysis provides an important dataset of 339 previously theorized plume migration behavior between fault zones and reservoir 340 units. This interpretation was otherwise not possible using a conventional analysis of 341 amplitude attributes. The factors which hindered a more straightforward amplitude-342 based analysis may occur commonly in projects, especially in onshore settings. The 343 much clearer picture of CO<sub>2</sub> plume anomalies provided by time shifts allowed a 344 meaningful integration of multiple independent measurements to produce a coherent 345 interpretation of the migration behavior of injected CO<sub>2</sub> at the Decatur site. We were 346 able to identify an interplay of capillary heterogeneity and upward flow of CO<sub>2</sub> along 347 permeable faults under buoyancy forces. In addition, we identify the role of pressure 348 gradients resulting from CO<sub>2</sub> injection at a neighboring project in causing the re-349 mobilization and flow of CO<sub>2</sub> at the Decatur project post-injection. These behaviors 350 and their impacts have been previously theorized, and the observations provided from 351 an industry scale geological CO<sub>2</sub> storage site provides important validation of these 352 theories and data from which future projects may be designed. 353

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358 **Open Research** 

The original dataset and reports used in this study were made publicly available by the National Energy Technology Laboratory through the Energy Data eXchange (ISGS, 2021a, 2021b). Bukar, 2024 provides the processed data and code used in this study. The codes are also accessible at <u>https://github.com/ImperialCollegeLondon/4d-</u> <u>seismic-co2</u>

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- Arts, R., Eiken, O., Chadwick, A., Zweigel, P., Van der Meer, L., & Zinszner, B.
  (2004). Monitoring of CO<sub>2</sub> injected at Sleipner using time-lapse seismic
  data [Publisher: Elsevier]. *Energy*, 29 (9-10), 1383–1392.
  <u>https://doi.org/10.1016/j.energy.2004.03.072</u>
- Bakulin, A., Lopez, J., Herhold, I. S., & Mateeva, A. (2007). Onshore monitoring
  with virtual-source seismic in horizontal wells: Challenges and solutions. In
  SEG Technical Program Expanded Abstracts 2007 (pp. 2893-2897).

373 Society of Exploration Geophysicists. <u>https://doi.org/10.1190/1.2793067</u>

Bauer, R., Will, R., Greenberg, S. E., & Whittaker, S. G. (2019). Illinois basin–
Decatur project. In *Geophysics and geosequestration* (pp. 339–369). Cambridge
University Press. <u>https://doi.org/10.1017/9781316480724.020</u>

Benguigui, A., Roberts, G., & Shaw-Champion, M. (2012). Time-lapse 2D seismic steam- flood monitoring-a case study from offshore republic of Congo, the Emeraude field. *74th EAGE Conference and Exhibition incorporating* 

- 380 *EUROPEC 2012*, cp–293. <u>https://doi.org/10.3997/2214-4609.20148837</u>
- 381 Brie, A., Pampuri, F., Marsala, A., & Meazza, O. (1995). Shear sonic 382 interpretation in gas-bearing sands. *SPE Annual Technical Conference and* -18-

- 383 *Exhibition*, SPE–30595. https://doi.org/10.2118/30595-MS
- Bukar, Idris. (2024). ImperialCollegeLondon/4d-seismic-co2: v0.0 (pre-release).
  [Software]. Zenodo. <u>https://doi.org/10.5281/zenodo.11165813</u>
- Caspari, E., Müller, T. M., & Gurevich, B. (2011). Time-lapse sonic logs reveal
   patchy CO<sub>2</sub> saturation in-situ. *Geophysical Research Letters*, 38 (13).
   <u>https://doi.org/10.1029/2011GL046959</u>
- Cavanagh, A. J., & Haszeldine, S. (2014). The Sleipner storage site: Capillary flow
  modeling of a layered CO<sub>2</sub> plume requires fractured shale barriers within the
  Utsira Formation [Publisher: Elsevier]. *International Journal of Greenhouse Gas Control, 21*, 101–112. <u>https://doi.org/10.1016/j.ijggc.2013.11.017</u>
- Chadwick, R., Arts, R., & Eiken, O. (2005). 4D seismic quantification of a growing
  CO<sub>2</sub> plume at Sleipner, North Sea [Issue: 1]. *Geological Society, London, Petroleum Geology Conference series, 6,* 1385–1399.
- 396 https://doi.org/10.1144/0061385
- 397 Chadwick, R., Arts, R., Eiken, O., Kirby, G., Lindeberg, E., & Zweigel, P. (2004).
- 4D seismic imaging of an injected CO<sub>2</sub> plume at the Sleipner Field, Central
  North Sea [Publisher: The Geological Society of London]. *Geological Society, London, Memoirs, 29* (1), 311–320.
  https://doi.org/10.1144/gsl.mem.2004.029.01.29
- 402 Coueslan, M. L., Ali, S., Campbell, A., Nutt, W., Leaney, W., Finley, R., & Greenberg,
- 403 S. (2013). Monitoring CO<sub>2</sub> injection for carbon capture and storage using
- 404 time- lapse 3D VSPs [Publisher: Society of Exploration Geophysicists]. *The*
- 405 *Leading Edge*, 32 (10), 1268–1276. <u>https://doi.org/10.1190/tle32101268.1</u>
- 406 Coueslan, M. L., Butsch, R., Will, R., & Locke II, R. A. (2014). Integrated reservoir
- 407 monitoring at the Illinois Basin–Decatur Project [Publisher: Elsevier]. *Energy*

-19-

408	Procedia, 63, 2836–2847. <u>https://doi.org/10.1016/j.egypro.2014.11.306</u>
409	Coueslan, M. L., Leetaru, H. E., Brice, T., Leaney, W. S., & McBride, J. H. (2009).
410	Designing a seismic program for an industrial CCS site: Trials and
411	tribulations [Publisher: Elsevier]. Energy Procedia, 1 (1), 2193–2200.
412	https://doi.org/10.1016/j.egypro.2009.01.285
413	Dockrill, B., & Shipton, Z. K. (2010). Structural controls on leakage from a natural
414	CO <sub>2</sub> geologic storage site: Central Utah, USA. Journal of Structural Geology,
415	32 (11), 1768–1782. <u>https://doi.org/10.1016/j.jsg.2010.01.007</u>
416	Falahat, R., Shams, A., & MacBeth, C. (2011). Towards quantitative evaluation of
417	gas injection using time-lapse seismic data [Publisher: European Association
418	of Geoscientists & Engineers]. Geophysical Prospecting, 59 (2), 310-322.
419	https://doi.org/10.1111/j.1365-2478.2010.00925.x
420	Faulkner, D., Jackson, C., Lunn, R., Schlische, R., Shipton, Z., Wibberley, C., & Withjack,
421	M. (2010). A review of recent developments concerning the structure,
422	mechanics and fluid flow properties of fault zones. Journal of Structural
423	<i>Geology</i> , <i>32</i> (11), 1557–1575. <u>https://doi.org/10.1016/j.jsg.2010.06.009</u>
424	Finley, R. J., Frailey, S. M., Leetaru, H. E., Senel, O., Cou"eslan, M. L., & Scott,
425	M. (2013). Early operational experience at a one-million tonne CCS
426	demonstration project, Decatur, Illinois, USA [Publisher: Elsevier]. Energy
427	Procedia, 37, 6149-6155. https://doi.org/10.1016/j.egypro.2013.06.544
428	Flemisch, B., Nordbotten, J. M., Fernø, M., Juanes, R., Both, J. W., Class, H., et
429	al., (2024). The FluidFlower validation benchmark study for the storage of
430	CO <sub>2</sub> . Transport in Porous Media, 151(5), 865-912.

-20-

- Freiburg, J., Morse, D. G., Leetaru, H. E., Hoss, R. P., & Yan, Q. (2014). A 432 depositional and diagenetic characterization of the Mt. Simon sandstone at the 433 Illinois Basin-Decatur Project carbon capture and storage site, Decatur, 434 Illinois, USA [Publisher: Illinois State Geological Survey, Prairie Research 435 436 Institute, University of Illinois Urbana-Champaign]. https://hdl.handle.net/2142/55338 437
- 438Furre, A.-K., Eiken, O., Alnes, H., Vevatne, J. N., & Kiær, A. F. (2017). 20 years439of monitoring CO2-injection at Sleipner [Publisher: Elsevier]. Energy440procedia,114,3916–3926.

441 <u>https://doi.org/10.1016/j.egypro.2017.03.1523</u>

- Furre, A.-K., Kiær, A., & Eiken, O. (2015). CO<sub>2</sub>-induced seismic time shifts at
  Sleipner [Publisher: Society of Exploration Geophysicists and American
  Association of Petroleum Geologists]. *Interpretation*, 3 (3), SS23–SS35.
  <u>https://doi.org/10.1190/INT-2014-0225.1</u>
- Gasda, S. E., Bachu, S., & Celia, M. A. (2004). Spatial characterization of the
  location of potentially leaky wells penetrating a deep saline aquifer in a
  mature sedimentary basin. *Environmental geology*, *46*, 707–720.
  <u>https://doi.org/10.1007/s00254-004-1073-5</u>
- Gassmann, F. (1951). Über die elastizität poröser medien: Vierteljahrss-chrift der
   Naturforschenden Gesellschaft in Zurich, vol. 96.
   <u>https://cir.nii.ac.jp/crid/1570291224657132800</u>
- Gay, A., Lopez, M., Berndt, C., & Séranne, M. (2007). Geological controls on
  focused fluid flow associated with seafloor seeps in the Lower Congo Basin.
  Marine and Petroleum Geology, 244, 68-92.
  http://doi/10.1016/j.margeo.2007.06.003

-21-

- Gilmore, K. A., Sahu, C. K., Benham, G. P., Neufeld, J. A., & Bickle, M. J. (2022). 457 Leakage dynamics of fault zones: Experimental and analytical study with 458 application to CO<sub>2</sub> storage. Journal of Fluid Mechanics, 931, A31. 459 https://doi.org/10.1017/jfm.2021.970 460
- Grude, S., Landrø, M., & Osdal, B. (2013). Time-lapse pressure-saturation 461 discrimination for CO<sub>2</sub> storage at the Snøhvit field [Publisher: Elsevier]. 462 International Journal of Greenhouse Gas Control, 19, 369–378. 463 https://doi.org/10.1016/j.ijggc.2013.09.014 464
- Hale, D. (2013). Dynamic warping of seismic images: Geophysics, 78. S105-S115. 465 466 https://doi.org/10.1190/geo2012-0327.1
- Han, D., & Batzle, M. (2014). FLAG fluid calculator. University of Houston 467 Fluids/DHI Consortium. 468
- Hansen, O., Gilding, D., Nazarian, B., Osdal, B., Ringrose, P., Kristoffersen, J.-B., 469
- Eiken, O., & Hansen, H. (2013). Snøhvit: The history of injecting and 470 storing 1 mt CO<sub>2</sub> in the fluvial tubåen fm. Energy Procedia, 37, 3565-
- 3573. https://doi.org/10.1016/j.egypro.2013.06.249 472

- Ivandic, M., Juhlin, C., Lueth, S., Bergmann, P., Kashubin, A., Sopher, D., Ivanova, 473
- A., Baumann, G., & Henninges, J. (2015). Geophysical monitoring at the 474
- Ketzin pilot site for CO<sub>2</sub> storage: New insights into the plume evolution 475
- [Publisher: Elsevier]. International Journal of Greenhouse Gas Control, 32, 476
- 90-105. https://doi.org/10.1016/j.ijggc.2014.10.015 477
- Johnston, D. H. (2013). Practical applications of time-lapse seismic data. Society of 478 Exploration Geophysicists. https://doi.org/10.1190/1.9781560803126 479
- Jung, N.-H., Han, W. S., Watson, Z., Graham, J. P., & Kim, K.-Y. (2014). Fault-480
- controlled  $CO_2$  leakage from natural reservoirs in the Colorado Plateau, east--22-481

- 482 central Utah. Earth and Planetary Science Letters, 403, 358–367.
  483 https://doi.org/10.1016/j.epsl.2014.07.012
- Kampman, N., Burnside, N. M., Shipton, Z. K., Chapman, H. J., Nicholl, J. A.,
  Ellam, R. M., & Bickle, M. J. (2012). Pulses of carbon dioxide emissions
  from intracrustal faults following climatic warming. Nature Geoscience, 5,
  352-358. https://doi.org/10.1038/ngeo1451
- Krevor, S., de Coninck, H., Gasda, S. E., Ghaleigh, N. S., de Gooyert, V.,
  Hajibeygi, H., Juanes, R., Neufeld, J., Roberts, J. J., & Swennenhuis, F.
  (2023). Subsurface carbon dioxide and hydrogen storage for a sustainable
  energy future [Publisher: Nature Publishing Group UK London]. *Nature Reviews Earth & Environment*, 1–17. <u>https://doi.org/10.1038/s43017-022-</u>
  <u>00376-8</u>
- 494Lahann, R., Rupp, J., Medina, C., Carlson, G., & Johnson, K. (2017). State of495stress in the Illinois Basin and constraints on inducing failure. *Environmental*496*Geosciences*, 24(3),123–150.
- 497 https://doi.org/10.1306/eg.0206171600817004
- 498 Landrø, M. (1999). Repeatability issues of 3-D VSP data. Geophysics, 64(6), 1673499 1679. <u>https://doi.org/10.1190/1.1444671</u>
- Landrø, M., & Stammeijer, J. (2004). Quantitative estimation of compaction and
  velocity changes using 4D impedance and traveltime changes [Publisher:
  Society of Exploration Geophysicists]. *Geophysics*, 69 (4), 949–957.
  https://doi.org/10.1190/1.1778238
- Leetaru, H., & Freiburg, J. T. (2014). Litho-facies and reservoir characterization of
   the Mt Simon Sandstone at the Illinois Basin–Decatur Project [Publisher:

-23-

506	Wiley Online Library]. Greenhouse Gases: Science and Technology, 4(5), 580-					
507	595. <u>https://doi.org/10.1002/ghg.1453</u>					
508	Lumley, D. E. (2001). Time-lapse seismic reservoir monitoring. Geophysics, 66(1),					
509	50-53. <u>https://doi.org/10.1190/1.1444921</u>					
510	MacBeth, C., Amini, H., & Izadian, S. (2020). Methods of measurement for 4D					
511	seismic post-stack time shifts [Publisher: Wiley Online Library]. Geophysical					
512	Prospecting, 68 (9), 2637–2664. https://doi.org/10.1111/1365-2478.13022					
513	MacBeth, C., & Izadian, S. (2023). A review and analysis of errors in post-stack					
514	time-shift interpretation. Geophysical prospecting, 71(8), 1497-1522.					
515	https://doi.org/10.1111/1365-2478.13391					
516	MacBeth, C., Mangriotis, MD., & Amini, H. (2019). Post-stack 4D seismic time-					
517	shifts: Interpretation and evaluation [Publisher: European Association of					
518	Geoscientists & Engineers]. Geophysical Prospecting, 67 (1), 3-31.					
519	https://doi.org/10.1111/1365-2478.12688					
520	Meunier, J., Huguet, F., & Meynier, P. (2001). Reservoir monitoring using					
521	permanent sources and vertical receiver antennae: The Céré-la-Ronde case					
522	study. The Leading Edge, 20(6), 622-629.					
523	https://doi.org/10.1190/1.1439008					
524	Miocic, J. M., Gilfillan, S. M., Roberts, J. J., Edlmann, K., McDermott, C. I., & Haszeldine,					
525	R. S. (2016). Controls on CO <sub>2</sub> storage security in natural reservoirs and					
526	implications for CO2 storage site selection. International Journal of Greenhouse					
527	Gas Control, 51, 118–125. <u>https://doi.org/10.1016/j.ijggc.2016.05.019</u>					
528	Illinois State Geological Survey (ISGS) (2021), Illinois Basin - Decatur Project					
529	(IBDP) Geological Models, July 7, 2021. Midwest Geological -24-					

530	Sequestration Consortium (MGSC) Phase III Data Sets. [Dataset]. DOE					
531	Cooperative Agreement No. DE-FC26-05NT42588.,					
532	https://doi.org/10.18141/1854141					
533	Illinois State Geological Survey (ISGS) (2021), Illinois Basin - Decatur Project					
534	(IBDP) Seismic Data, July 7, 2021. Midwest Geological Sequestration					
535	Consortium (MGSC) Phase III Data Sets. [Dataset]. DOE Cooperative					
536	Agreement No. DE-FC26-05NT42588., https://doi.org/10.18141/1854142					
537	rdbotten, J. M., Kavetski, D., Celia, M. A., & Bachu, S. (2009). Model for CO2					
538	leakage including multiple geological layers and multiple leaky wells.					
539	Environmental science & technology, 43 (3), 743–749.					
540	https://doi.org/10.1021/es801135v					
541	Onishi, T., Nguyen, M. C., Carey, J. W., Will, B., Zaluski, W., Bowen, D. W., Devault,					
542	B. C., Duguid, A., Zhou, Q., Fairweather, S. H., et al. (2019). Potential CO <sub>2</sub>					
543	and brine leakage through wellbore pathways for geologic CO <sub>2</sub> sequestration					
544	using the national risk assessment partnership tools: Application to the big					
545	sky regional partnership. International Journal of Greenhouse Gas Control,					
546	81, 44-65. https://doi.org/10.1016/j.ijggc.2018.12.002					
547	Pevzner, R., Shulakova, V., Kepic, A., & Urosevic, M. (2011). Repeatability analysis					
548	of land time-lapse seismic data: CO2CRC Otway pilot project case study.					
549	Geophysical prospecting, 59(1), 66-77. <u>https://doi.org/10.1111/j.1365-</u>					
550	<u>2478.2010.00907.x</u>					
551	Pörtner, H., Roberts, D. C., Poloczanska, E., Mintenbeck, K., Tignor, M., Alegria,					
552	A., Craig, M., Langsdorf, S., Löschke, S., Möller, V., et al. (2022). IPCC,					
553	2022: Summary for policymakers [Publisher: Cambridge University Pres].					
554	https://doi.org/10.1017/9781009325844.001 -25-					

555	Ringrose, P., Andrews, J., Zweigel, P., Furre, AK., Hern, B., & Nazarian, B.
556	(2022). Why ccs is not like reverse gas engineering. First Break, $40(10)$ ,
557	85-91. https://doi.org/10.3997/1365-2397.fb2022088

- Roach, L. A., & White, D. (2018). Evolution of a deep CO<sub>2</sub> plume from time-lapse
  seismic imaging at the Aquistore storage site, Saskatchewan, Canada. *International Journal of Greenhouse Gas Control*, 74, 79–86.
  https://doi.org/10.1016/j.ijggc.2018.04.025
- Roelofse, C., Alves, M. T., & Gafeira, J. (2020). Structural controls on shallow
  fluid flow and associated pockmark fields in the East Breaks area, northern
  Gulf of Mexico. Marine and Petroleum Geology, 112, 104074.
  <a href="https://doi.org/10.1016/j.marpetgeo.2019.104074">https://doi.org/10.1016/j.marpetgeo.2019.104074</a>
- Santos, J. M., Davolio, A., MacBeth, C., & Schiozer, D. J. (2016). 4D seismic
  interpretation of the Norne Field-a semi-quantitative approach [Issue: 1]. *78th EAGE Conference and Exhibition 2016*, 2016, 1–5.
  https://doi.org/10.3997/2214-4609.201601313
- 570 Schlumberger Petrotechnical Services (2015). *Time-Lapse 3D VSP Processing*
- 571 Report, Illinois State Geological Survey Illinois Basin Decatur Project
  572 Geophysical Monitoring Well #1, September 2015, 3D VSP Processing
  573 (tech. rep.).
- Shipton, Z. K., Evans, J. P., Kirschner, D., Kolesar, P. T., Williams, A. P., & Heath,
  J. (2004). Analysis of CO<sub>2</sub> leakage through 'low-permeability' faults from
  natural reservoirs in the Colorado Plateau, east-central Utah. From:
  BAINES, S. J. & WORDEN, R. H. (eds) 2004. Geological Storage of
  Carbon Dioxide. Geological Society, London, Special Publications, 233,

-26-

- 579 43-58. <u>https://doi.org/10.1144/GSL.SP.2004.233.01.05</u>
- 580Stork, C. (2020). How does the thin near surface of the earth produce 10–100 times581more noise on land seismic data than on marine data? *First Break*, 38(8), 67–58275. https://doi.org/10.3997/1365-2397.fb2020062
- 583 Strandli, C. W., & Benson, S. M. (2013). Identifying diagnostics for reservoir
  584 structure and CO<sub>2</sub> plume migration from multilevel pressure measurements.
  585 *Water Resources Research*, 49 (6), 3462–3475.
  586 https://doi.org/10.1002/wrcr.20285
- 587 Strandli, C. W., Mehnert, E., & Benson, S. M. (2014). CO<sub>2</sub> plume tracking and
  588 history matching using multilevel pressure monitoring at the Illinois Basin–
  589 Decatur Project. Energy Procedia, 63, 4473–4484.
  590 <u>https://doi.org/10.1016/j.egypro.2014.11.483</u>
- 591 Swager, L. (2019). ADM CCS1 Injection Well Mechanical Integrity Report March
  592 2019 Pulsed Neutron eXtreme (tech. rep.).
- 593 Williams-Stroud, S., Bauer, R., Leetaru, H., Oye, V., Stanek, F., Greenberg, S., &
- Langet, N. (2020). Analysis of microseismicity and reactivated fault size to
  assess the potential for felt events by CO<sub>2</sub> injection in the Illinois Basin.
  Bulletin of the Seismological Society of America, 110(5), 2188-2204.
  https://doi.org/10.1785/0120200112
- Yang, Z., Xu, T., Wang, F., Yang, Y., Li, X., & Zhao, N. (2018). Impact of inner
  reservoir faults on migration and storage of injected CO<sub>2</sub>. *International Journal of Greenhouse Gas Control*, 72, 14–25.
  https://doi.org/10.1016/j.ijggc.2018.03.006
- 602 Zaluski, W., & Lee, S.-Y. (2021). 2020 IBDP Final Static Geological Model

- 603 *Development and Dynamic Modelling* (tech. rep.).
- Contraction Contra
- $CO_2$  storage efficiency due to the impact of faults on  $CO_2$  migration in an
- 606 interbedded saline aquifer. International Journal of Greenhouse Gas Control,
- 607 *133*, 104104. <u>https://doi.org/10.1016/j.ijggc.2024.1</u>

# Supporting information for "Carbon dioxide migration along faults at the Illinois Basin – Decatur Project revealed using time shift analysis of seismic monitoring data"

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- 2. S2 Evaluating the possibility of CCS2 as the source of the late  $CO_2$  arrival at injection well post-injection
- 3. Table S1:

#### S1 Feature-based Warping Approach to Time Shift Analysis

We introduce *Feature-based Warping* (*FW*), a modification to Dynamic Time Warping (DTW), which seeks to align matching features (peaks and troughs) in two seismic traces. The dissimilarity error is defined as:

 $e_{feature}[i, q] = d(f_{feature}[i], g_{feature}[i+l])$ 

where  $f_{feature}[i]$  and  $g_{feature}[i+l]$  are the positions of key features in the baseline and monitor traces, respectively, and  $d(f_{feature}[i], g_{feature}[i+l])$  is a measure of the distance between the features in the two traces, in this case the L1 or Manhattan distance.

#### **S1.1 Synthetic Modelling**

We use well log data from well CCS1 to generate a 1D (pseudo-2D) synthetic model. The well logs are displayed in Figure S1. We select three zones from the RST logs for March 2012 (equivalent to M1) to substitute CO<sub>2</sub>; the main injection interval (Mt. Simon A – Lower), a 30-meter interval in Mt. Simon A – Upper, and a 5-meter interval in Mt. Simon C where there is a detection of CO<sub>2</sub> from the RST logs.



Figure S1: Synthetic modelling based on well log data from CCS1. Baseline and monitor scenarios are produced.

For these zones we choose a 10% CO<sub>2</sub> saturation. Fluid replacement was performed using Gassmann fluid substitution with both fully uniform and patchy mixing to create dynamic or monitor scenarios. The model of acoustic impedance is then convolved with a statistical wavelet extracted from the VSP baseline (B2) so it represents the frequency characteristics in the reservoir region. The same wavelet is used to produce a synthetic seismic for the monitor scenarios. Random noise of 60 dB S/N is added to the outputs. This is shown in Figure S1.

#### S1.2 Feature-based warping execution

Features (peaks and troughs) are found through a sequential search for local maxima through the traces. Corresponding features are then matched. To avoid cycle skipping challenges caused by spurious features present in one trace but not the other, band pass or low pass filtering may be applied. The features are used to construct a cost matrix where the cost increases with the distance between matched features. The magnitudes of amplitudes of the features are irrelevant. By comparison, the cost matrix for a DTW approach is based on the absolute difference in amplitudes of all pairs of sample points in the traces.

We compare the results of Feature-based Warping (FW), Dynamic Time Warping (DTW), and the true relative velocity change. The feature-based warping approach produces less artefacts and is more efficient as there are less points of comparison. This approach is also able to reliably detect thin layers of CO<sub>2</sub> at low saturations even at lower frequencies, illustrating the robustness of the time shifts detected by this method.



**Figure S2: Uniform mixing** – Comparison of the feature-based approach with DTW and the true relative velocity change for uniform mixing.



**Figure S3: Patchy mixing** – Comparison of the feature-based approach with DTW and the true relative velocity change for fully patchy mixing.





**Figure S4:** (a) Plume footprint equivalent to 687,000 t of CO<sub>2</sub> derived using a simplified mass and volume balance. We consider flow through only the top one-third thickness of the injection zone at a conservative CO<sub>2</sub> saturation of 0.2 and with no dissolution. (b) Well correlation panel showing wells CCS1, CCS2 and VW1 with no CO<sub>2</sub> detection at VW1.



Figure S5: Processing block diagram for 4D VSP data from raw to deconvolution (Schlumberger, 2015).



Figure S6: Processing block diagram for depth migration performed on the 4D VSP data (Schlumberger, 2015).

**Table S1:** Time-lapse VSP survey dates, ground conditions during acquisition and injected  $CO_2$  quantity. Repeated shots refer to the number of shots in the monitor surveys that were co-located with the Baseline 2 survey (i.e., within 50 feet spatial tolerance in source easting and northing coordinates). Co-location issues were encountered due to permit issues with local landowners and the construction of new electrical and industrial infrastructure at the site.

Survey	Date	Ground conditions	Vibrator sweep (Hz)	Repeated shots (relative to B2)	Amount of CO <sub>2</sub> injected (tonnes)
Baseline 1 (B1)	Jan. 27-30, 2010	Wet	2-100	-	Pre-injection
Baseline 2 (B2)	Apr. 12-14, 2011	Dry	8-120	-	Pre-injection
Monitor 1 (M1)	Feb. 11-12, 2012	Frozen/Dry	8-120	467	74,000
Monitor 2 (M2)	Apr. 4-5, 2013	Damp	8-120	385	433,000
Monitor 3 (M3)	Feb. 3-5, 2014	Frozen	8-120	378	730,000
Monitor 4 (M4)	Jan. 15-17, 2015	Frozen	8-120	458	~1,000,000