

Insights into the interaction of a shale with CO₂

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Abstract

Caprock formations such as shales, play a key role to safe underground CO₂ storage since they serve as a hydromechanical barrier that prevents migration of the injected CO₂ to the surface. While their hydromechanical response is important to ensure their sealing capacity, interaction with the injected CO₂ involves additional thermo-chemo-mechanical (THMC) phenomena that may threaten the long-term integrity of the caprock. The low transport properties of shales make them a suitable caprock material, but at the same time challenging to study due to the very long time scales (months/years) that are required for the various THMC processes to manifest. In this work, long-term the multiphysical interaction of the Opalinus Clay shale with liquid and supercritical CO₂ is studied in 3D with live x-ray tomography. 3D analysis reveals the localised response of the coupled THMC processes that is often indistinguishable with conventional lab testing protocols. To improve spatial and temporal resolution while applying field-representative pressure and temperature conditions, small size samples are studied. Long-term injection of liquid CO₂ resulted in significant fissuring of calcite-rich zones that were for the first time visualised and quantified from the x-ray images. Additionally, a re-arrangement of the pre-existing micro-fissures in the clay matrix was observed. The volumetric response during direct exposure of an Opalinus Clay sample to supercritical CO₂ revealed an initial swelling at pre-fissured zones and initiation of new micro-fissures at areas of direct contact with the anhydrous CO₂ due to pore

water evaporation. Advanced 3D image analysis showed an increasing CO₂ uptake in the caprock material with time, suggesting potential CO₂ trapping in the material.

1 Introduction

Geological CO₂ Storage (GCS) is an efficient way to permanently store large volumes of captured CO₂, by subsurface injection at pressures higher than its critical pressure ($P_{cr, CO_2} = 7.4$ MPa) where it changes from gaseous to liquid state, and above a certain temperature level ($T_{cr, CO_2} = 31.2^\circ\text{C}$) to supercritical. This high pressure level strongly encourages the selection of deep reservoirs (min. 700-800 m depth), where the in situ water/brine pressure equilibrates the injected CO₂ pressure. According to the most recent IPCC report (IPCC, 2022), Carbon Capture and Storage (CCS) is key to reaching net-zero emissions by mid-century and mitigating climate change. Besides, the need to implement CCS in a range of sectors including energy production, manufacturing and industry is underlined in the same report.

The feasibility of the technology relies on successful long-term subsurface storage which depends – at least during the first few decades – on the performance of nearly impermeable geological formations (seal/caprock) that will prevent CO₂ migration to the surface. Caprock formations, typically shales or other tight mudrocks, are highly heterogeneous in mineralogy with low mass transfer properties and high sealing capacity. However, their response to Thermo-Hydro-Chemo-Mechanical (THMC) loads remains a complex subject that deserves further inquiry.

Shales have been studied since decades by the oil and gas industry, more recently for their use as geological barriers for radioactive waste storage, but full understanding of their suitability for geological CO₂ storage is still somewhat limited, since CO₂ injection further complicates an already difficult engineering problem: (i) Unlike water or brine, CO₂ diffusion results in acidification of the in situ brine that can lead to chemical interactions in the caprock and alteration of its mechanical and transport properties (Yang et al., 2022); (ii) CO₂ injection introduces stress state changes in both the reservoir and the overlaying caprock that can cause reactivation of pre-existing faults or creation of new fracture systems (Vilarrasa et al., 2019).

Significant progress on experimental data collection has been achieved on various scales (Armitage et al., 2010; Houben et al., 2013), related to both geomechanical response (Rutqvist, 2012;

Wang and Tokunaga, 2015; Kivi et al., 2022) and chemical interactions (Wollenweber et al., 2010; Hadian and Rezaee, 2020) during exposure to CO₂-rich fluids. Shales are anisotropic in their THM response and highly heterogeneous in mineralogy at different scales (micro to macro). In particular, the strong geomechanical and geochemical couplings of shales often challenge our ability to distinguish the different occurring phenomena and estimate their time-scale during CO₂ exposure.

In recent years, the Opalinus Clay shale has been studied as a potential caprock in the context of geological CO₂ storage (Amann et al., 2013; Favero et al., 2016; Makhnenko et al., 2017; Sciandra et al., 2021), because of its favourable properties, such as low porosity (< 20 %), low permeability (in the order of 10⁻²⁰ m²), high clay content (40-80 %), swelling properties and high sealing capacity (Marschall et al., 2005; Crisci et al., 2019; Delage and Belmokhtar, 2022). These favourable properties of Opalinus Clay (and shales more generally) make it a challenging material to study due to the slow flow processes at resolutions that may fall within the measurement error (Minardi et al., 2021).

Representative testing of shales remains a big issue. Testing conditions do not only involve the applied level of pressure or temperature but also the spatial and temporal scale of the measurement. Whereas large scale experiments are generally considered to be more realistic, they can be challenging to properly monitor and analyse since they involve the combination of multiple phenomena that occur under different scales, in particular in heterogeneous materials such as shales. A real scale experimental campaign has been recently completed at the Underground Research Laboratory (URL) in Mont Terri, where CO₂-rich brine has been injected in an existing fault in Opalinus Clay (Zappone et al., 2021). The results have not been conclusive, mainly due to the low applied pressure, the small volume of injected CO₂ and the long time-duration that is required for transport phenomena to manifest on that scale. In parallel, recent lab-scale experimental results from CO₂ injection tests in Opalinus Clay samples, do not show evidence of significant influence on the fundamental properties of the material for the given test duration : grain density, dominant entrance pore size and void ratio, as well as hydraulic conductivity do not vary in a considerable way after exposure to CO₂ over a time-scale of a few weeks (Minardi et al., 2021; Favero & Laloui, 2018). The short duration of these tests together with the sample size could be among the reasons for the absence of measurable evolution.

Representative testing conditions and duration are even more challenging when processes of geochemical nature are investigated. While shales contain minerals reactive to CO₂, current lab measure-

81 ments are not sufficient in identifying chemical interactions directly, since they rely either on post-
82 mortem analysis of fluid composition or mineralogy (Armitage et al., 2013; Elkady and Kovscek,
83 2020). The indirect interpretation of permeability results before and after CO₂ exposure can be am-
84 biguous in terms of chemical alterations. This is because they may involve self-compensating mech-
85 anisms such as carbonate dissolution, mechanical crushing and inelastic compaction, as shown by
86 various authors who studied fractured caprock samples (Yasuhara et al., 2011; Hashemi and Zoback,
87 2021). It is thus difficult to build solid conclusions on the impact of chemical interactions on the
88 structural properties of the material, and consequently on its transport and mechanical response.

89 Taking all the above into account, there is a series of issues when testing shales in the context
90 of CO₂ storage: (i) Flow is extremely slow, resulting in long testing durations; (ii) Measured per-
91 meability variations are close to the measurement error; (iii) Reproduction of real site conditions is
92 crucial since injection pressure, and therefore effective stress, has an important impact on properties
93 of the material that drive flow and breakthrough, i.e. connected porosity; (iv) Chemical interactions
94 are limited by the slow transport properties of the material; (v) The testing duration is usually not
95 enough to allow investigation in that direction.

96 In this work, the different coupled processes and phenomena that occur when CO₂ interacts with
97 a shaly caprock material – the Opalinus Clay – are explored based on a series of measurements and
98 observations from real time x-ray tomography. Taking full advantage of this non-destructive tool,
99 new aspects and results are targeted aiming at improving our understanding of the caprock response
100 under field-realistic testing conditions. The originality of the presented research relies mainly on two
101 aspects: first, the study of smaller size samples, where observation period is expected to be shorter,
102 and second, on the direct measurement of strain fields and structural alteration from the 3D analysis
103 of the tomographic images. In the following, the proposed methodology, tools and conventions of
104 analysis are presented in detail. The results of two experimental campaigns where Opalinus Clay is
105 exposed to either liquid or supercritical CO₂ are presented and discussed. These experiments target
106 different coupled mechanisms, that combined, aim to contribute to a more profound understanding of
107 the overall THMC response of shales with CO₂.

108 **2 Methodology, tools and principles of analysis**

109 Shales are highly heterogeneous and anisotropic materials, sensitive to THM variations, with strong
110 multiphysical couplings and very slow transport properties (Mohajerani et al., 2014; Favero et al.,
111 2016; Menaceur et al., 2016; Li and Laloui, 2017). Inevitably, representative testing of shales re-
112 quires the employment of methods and tools that can embrace these particularities. These should in-
113 clude controlled applied conditions and full-field measurement, i.e. a field record of a quantity (e.g.,
114 deformation, density, temperature, etc.) as opposed to point-wise data (Viggiani and Hall, 2008).

115 Taking into account all the above, the development of a new approach in testing shales with in
116 situ x-ray tomography is motivated. In this study, the full-field of micro-structural variations and
117 kinematics of the Opalinus Clay shale when exposed to CO₂ under different boundary conditions
118 are targeted with 3D image analysis of real-time x-ray tomographies. Long-duration exposure of
119 Opalinus Clay to injected liquid CO₂ (8 MPa) under confined conditions (10 MPa) aims to reveal
120 potential chemo-mechanical processes. Direct exposure ofunjacketed Opalinus Clay to supercritical
121 CO₂ targets the better understanding of localised THM interactions that are otherwise difficult to
122 detect with conventional lab-testing techniques.

123 Despite the classic testing approaches on centimetric size shale samples in the literature, in this
124 work micro-samples (5 mm) are studied in order to first, improve the temporal resolution (partly
125 inspired by small-scale permeability testing equipment (Birmipilis et al., 2019; Birmipilis and Dijkstra,
126 2021), but also to optimise the quality of x-ray imaging (improved spatial resolution). This approach
127 is challenging for the given material and the given subject. The pore size of shales is in the order
128 of nanometres and thus impossible to visualise with x-ray micro-tomography (micrometric scale).
129 Nonetheless, observation and quantification of microstructural modifications due to interaction with
130 CO₂ can be explored with high scanning resolutions (5-8 $\mu\text{m}/\text{px}$) and fast tomographies thanks to the
131 small size of the sample.

132 **2.1 In situ x-ray micro-tomography and experimental protocol**

133 A few authors have investigated the mineralogical heterogeneity and THM anisotropic behaviour of
134 shales, pointing out the role of the microstructure with the employment of different imaging tech-
135 niques (Wang et al., 2013; Desbois et al., 2017; Delage & Tessier, 2021). In the case of experimental

136 geomechanics, x-ray tomography is the most widely used technique, with a large range of results
137 stated in literature (Viggiani et al., 2015; Bedford et al., 2017; Vego et al., 2022; Birmpilis et al.,
138 2022). The great advantage of x-ray tomography compared to other techniques for soil characteri-
139 sation (e.g. SEM microscopy), is the possibility to identify the mineralogical heterogeneity of the
140 specimen in 3D and follow its evolution in time (in situ testing). X-ray tomography is a very pow-
141 erful tool that allows a better interpretation of test results, such as measured permeability, fissuring,
142 localised deformation or structural modifications (Voltolini and Ajo-Franklin, 2020; Stavropoulou et
143 al., 2020).

144 For this study, the dual x-ray source in PIXE platform for x-ray micro-tomography (EPFL, Switzer-
145 land) is used. Reconstructions are performed with the XAct software provided by RX-Solutions (An-
146 necy, France), with appropriate beam-hardening corrections applied. A cylindrical cell made out of
147 PEEK (polyether ether ketone) is used for the application of the various boundary conditions, that
148 are explained in detail in the following sections. The so called PEEKcell is fixed on the rotating ta-
149 ble, as close as possible to the x-ray source, for a maximal use of the x-ray conical beam. All scans
150 are performed in temperature controlled environment at 21°C. The PEEKcell is designed to host
151 5 mm × 5 mm cylindrical samples and can sustain a maximal pressure and temperature of 20 MPa
152 and 80°C respectively (Stavropoulou and Laloui, 2022). An entry on each side of the cell (top and
153 bottom) allows the application of confining pressure (top) and pore pressure (bottom) on the sample.
154 The cell is disconnected from the pressure controllers and transported under the pressure state in the
155 tomograph. To monitor the pressure level during the scans, a pressure transducer is placed on both
156 ends (see Fig. 1).

157 The samples are cut to cylindrical shape of $d = h = 5$ mm by cutting rectangular pieces with
158 a saw, which were then reduced to the desired size manually using fine sand paper (P240). This
159 technique has been preferred (to a mechanical lathe for example) in order to avoid overheating the
160 sample during preparation. The resaturation of the samples has been achieved progressively under
161 free swelling conditions by exposing the samples in a relative humidity (RH) controlled environment
162 with the use of an appropriate saline solution (Romero, 2001): first to RH = 75 % (NaCl) and then
163 RH = 98 % (K_2SO_4) until mass stabilisation. Before testing, samples have achieved a close-to-full
164 saturation state, corresponding to a measured water content $w_{resat} = 6.1 - 6.8$ %, i.e. within the range

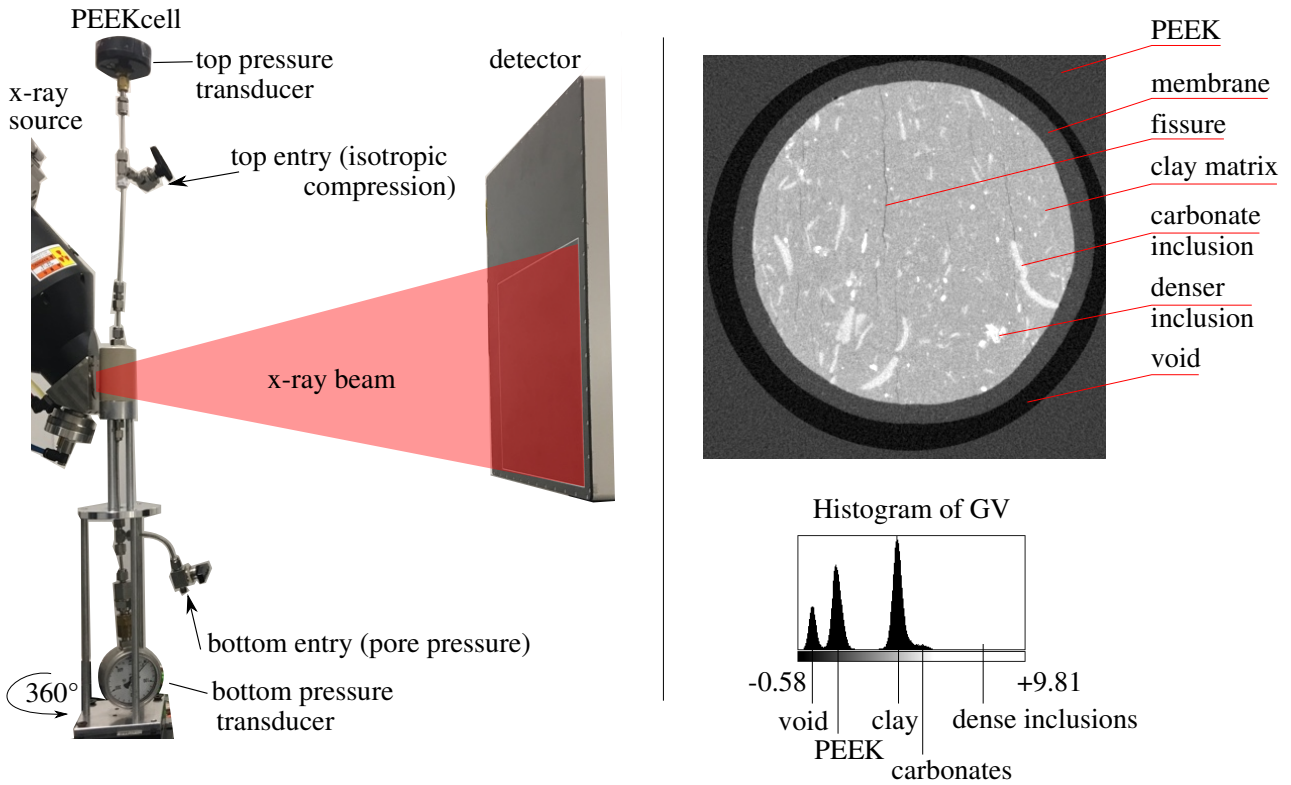


Figure 1: (left:) PEEKcell setup in the x-ray tomograph, (right:) horizontal slice of a reconstructed x-ray image and the corresponding histogram of grey values

of full saturation (Bossart and Thury, 2011).

In this work, first the micro-structural modifications due to long-duration CO_2 exposure are investigated with post-mortem measurements and analysis, i.e. after removing the applied pressures. Then, the occurring kinematics on Opalinus Clay that is exposed in direct contact (no sealing membrane) with supercritical CO_2 are examined with in situ measurements, i.e. while under pressure in the cell. According to the volumetric response of the sample and the corresponding grey values (GV) of the x-ray images, the CO_2 uptake is investigated and visualised.

When supercritical CO_2 is injected, a thermal jacket is used around the cell and the applied temperature is monitored with a thermal sensor that is placed between the jacket and the PEEKcell. For achieving a maximal resolution and x-rays penetration the thermal jacket is removed during the scans. Inevitably, this leads to CO_2 phase change from supercritical (lower density) to liquid (higher density) and consequently to a pressure drop under constant volume conditions, i.e. conditions during scanning. The cell is exposed to the temperature of the scanner (21°C) two hours in advance, while maintaining the pressure at the desired level (pressure pump connected), in order to avoid pressure

179 loss due to phase change during the scan. The possible implications of this CO₂ phase transition
180 before the scans are discussed in the corresponding section of direct exposure to supercritical CO₂.

181 **2.2 Image analysis**

182 The result of an x-ray tomography is a 3D x-ray attenuation map of the scanned sample that is as-
183 sociated to the 3D density map of the material. For instance dense phases in the material (non-clay
184 mineral inclusions) attenuate more x-rays than lower density phases (e.g. cracks, pores). The dif-
185 ferent density (attenuation) levels are reflected in the grey level values of the reconstructed 3D x-ray
186 image. Higher GV corresponds to denser phases and lower GV to less dense phases as indicated in
187 Fig. 1-right. Changes in the GV of a sample image in time or due to application of a different load,
188 allow the observation and quantification of localised micro-structural modifications (e.g. crack open-
189 ing/closing, swelling/shrinking) which can subsequently be translated to 3D strain fields with Digital
190 Volume Correlation (DVC). In this work, the open source SPAM software (Stamati et al., 2020) is
191 used for the DVC analysis.

192 In DVC, two images are required, an initial (reference image) and a deformed one. In the case
193 of local-DVC (that is used for the image analysis in this work), a grid with a given node spacing is
194 defined and at each grid point a centred window is extracted. For each of these subvolumes a linear
195 deformation function Φ is calculated so that $\text{image}_{\text{deformed}}(\Phi \cdot x) = \text{image}_{\text{reference}}(x)$. The function Φ
196 accounts for translation, rotation and stretching and its calculation is optimised by solving an iterative
197 problem that minimises error based on the classic sum of squared difference (SSQD). Whereas DVC
198 can calculate a strain field that can then be applied on an image, it does not take into account by
199 definition the variations of GV due to the corresponding strain. Deformation-based GV correction as
200 per Stavropoulou et al., (2020) is going to be applied in this work, aiming to investigate phase changes
201 due to chemical reactions between the in-contact CO₂ with the same material.

202 For each type of test, all scans are performed under the same conditions and with the same scan-
203 ning parameters. Nevertheless, noise, artefacts or other external changes may be present between the
204 different scans. To improve the accuracy of image analysis and minimise the GV variations due to
205 measurement conditions rather than real changes in the material, all images from the same testing
206 campaign are normalised based on GV of materials, the density of which is not supposed to vary be-

207 tween the different scans (here PEEK and aluminium). GV normalisation results in scaling the given
208 images so that the voxels that correspond to void are set to $GV = 0$ and those of PEEK correspond to
209 $GV = 1$. The followed procedure is explained in detail in the Appendix.

210 Finally, the occasional rigid-body transformation of the sample (translation and rotation) is calcu-
211 lated based on a single Φ function for the entire image (so called registration) and removed. DVC is
212 then performed between the reference image and the deformed ones, from which rigid body motion
213 has been corrected. The displacement field is then calculated and converted to strain assuming small
214 transformations (see details in Stamati et al., 2020). The above principles and conventions are applied
215 for the analysis of the different series of x-ray scans that are presented in the following.

216 **3 Long-term micro-structural modifications**

217 In this section, the long-term chemo-mechanical interactions that can occur between CO_2 and a shaly
218 caprock are explored. First, a mineralogical analysis of different Opalinus Clay samples is performed
219 with x-ray diffraction (XRD) measurements, in order to evaluate the mineralogical variability given
220 the small size of the samples ($5\text{ mm} \times 5\text{ mm}$). Then the mineralogical map of an Opalinus Clay sam-
221 ple is studied with SEM-EDX (scanning electron microscopy and energy dispersive x-ray) measure-
222 ments and the identified mineral locations are directly compared and identified in the corresponding
223 slices from the x-ray tomography image of the same sample. The goal of this combined analysis is
224 twofold. On one hand, it aims at locating and showing the presence of elements in the sample that
225 may favour chemical interactions in the long-term presence of CO_2 (e.g. Ca, C, Si, S, O etc.). On
226 the other hand, this analysis aims at evaluating the response of the identified mineral phases based
227 on the occurring micro-structural modifications that are identified from x-ray tomography (fissuring,
228 swelling, self-sealing etc.).

229 Table 1 shows the mineralogical composition of four sister Opalinus Clay samples (shaly facies)
230 from XRD measurements. The fit was optimised on one sample and to increase comparability, the
231 next fits were done by keeping all refined parameters and replacing the data file on the current model.
232 A similar quartz and clay content is measured for all samples except for illite that presents variations
233 up to 8 %. In the lower illite-rich samples a higher calcite content is measured with values that vary
234 among the different samples from 13 % to 24 %. The different content values that are presented for

sample A (in bold), are measured after long-term exposure to CO₂. It presents a high calcite content that is unclear if it is affected in any way by its previous interaction with CO₂ since its overall mineral content falls within the variability of the other three untreated samples. Nevertheless, even after long-term CO₂ exposure, the mineralogical composition of sample A does not vary in a significant way compared to the other three untreated samples. Sample A is used to compare the results from all different imaging tools that are employed for this study.

Opalinus Clay (wt %)	A	X	Y	Z
Calcite	21	13	16	24
Quartz	13	13	14	11
Chlorite	15	15	13	17
Kaolinite	3	2	2.5	1.5
Illite	45.5	53.5	52	45.5
Siderite	2	2	2	11.5
Pyrite	0.5	0.5	0.5	0.5

Table 1: Mineralogical composition of four sister Opalinus Clay samples based on x-ray diffraction

The mineralogical nature of the non-clay inclusion phases of the x-ray tomography images are identified with SEM-EDX measurements. The height of the sample is carefully reduced to the height of the horizontal slice of Fig. 2 (a) using sandpaper (the traces of which are apparent in the SEM images). Figure 2 presents the combined information obtained from both x-ray tomography and SEM-EDX at the same horizontal slice. In Fig. 2 (a), the different GV levels of the x-ray slice highlight the distribution of the different inclusions in the clay matrix, the mineralogy of which is identified from the EDX analysis. There are two sets of inclusions as revealed from the GV histogram plotted in Fig. 2 (b). This becomes more significant by taking into account that a second peak representing the lower GB inclusions is visible after the applications of a bilateral filter.

These lower GV level inclusions are rich in calcium (Ca) and carbon (C), i.e. calcite (CaCO₃), as revealed from the EDX images (Fig. 2 (a) and (d)). These carbonate inclusions are therefore prone to react (dissolve) in the presence of CO₂. The denser inclusions (brighter inclusions in Fig. 2 (a) at the bottom left of the sample) seem to be rich in sulphur (S) (see Fig. 2 (c)), a main element of pyrite (FeS₂) the density of which is very high.

Sample A is the same sample that has been used in (Stavropoulou and Laloui, 2022). It has first been scanned in the x-ray tomograph under unconfined conditions, then after application of con-

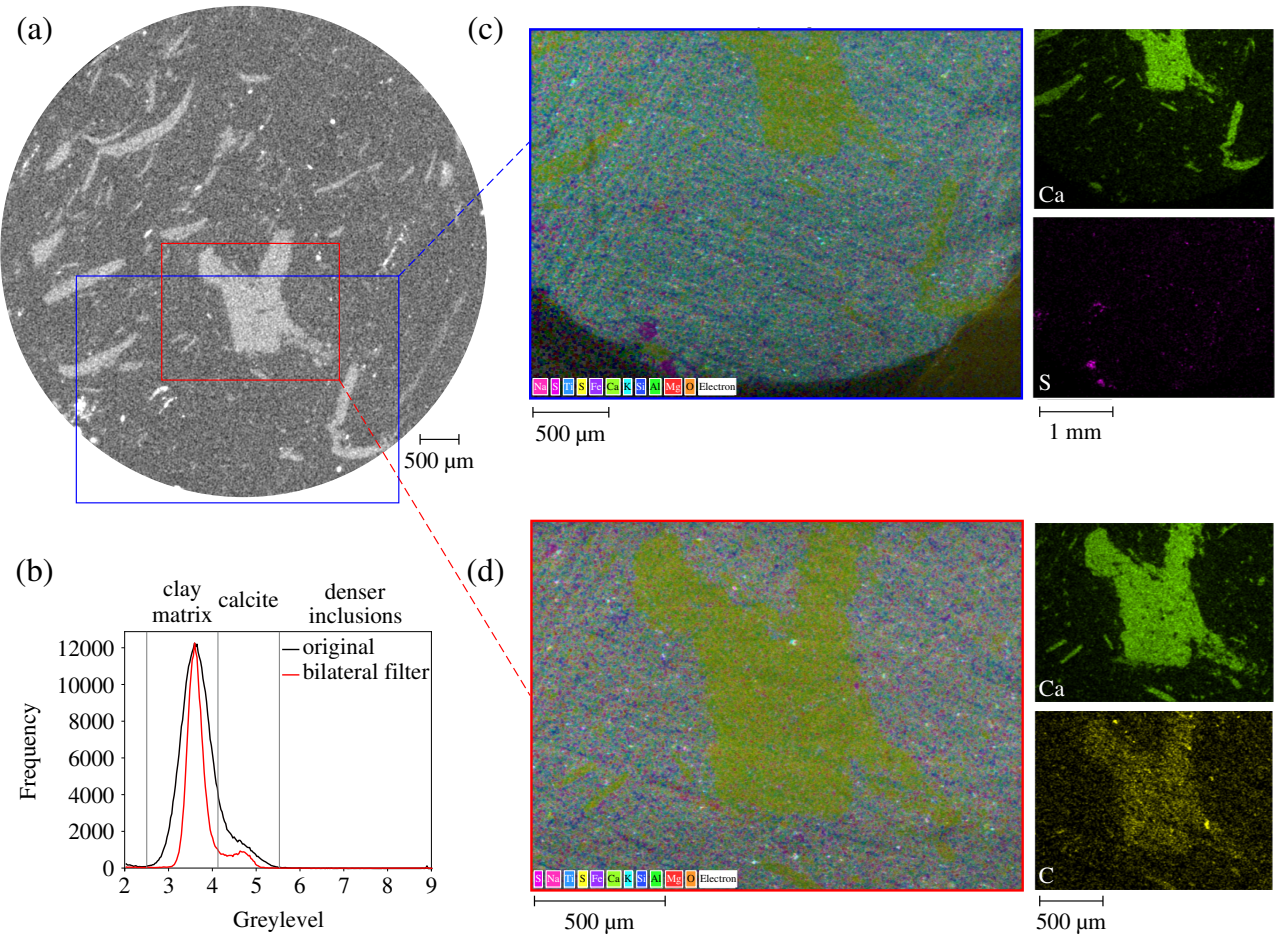


Figure 2: Identification of the inclusions mineralogy combining x-ray tomography and SEM-EDX – (a) horizontal x-ray tomography slice, (b) histogram of GV's of the top horizontal slice, (c) SEM-EDX map corresponding to the blue window of the x-ray slice highlighting all identified elements and the areas rich in Ca and S, (d) SEM-EDX map corresponding to the red window of the x-ray slice highlighting all identified elements and the areas rich in Ca and C

finement (10 MPa) CO_2 was injected up to a pressure of 8 MPa (pixel size $7.8 \mu\text{m}$). After CO_2 breakthrough, it has been held under constant volume conditions in the PEEKcell for 9 months and scanned again in the x-ray tomograph after pressure release (same pixel size and scanning parameters). It is important to mention that there has been pressure loss during these 9 months that has not been properly monitored: during the last 5 months the confining pressure has been reduced to half and the CO_2 pressure to 1 MPa. Nevertheless, the results present great interest and possible impact of this pressure loss is discussed in Section 5.

Figure 3, shows a horizontal and vertical slice of two x-ray scans of sample A, initially and after 9 months of CO_2 exposure, both in unconfined conditions. In its initial state, the sample contains a series of pre-existing fissures in the clay matrix of vertical orientation, i.e. similar to the bedding

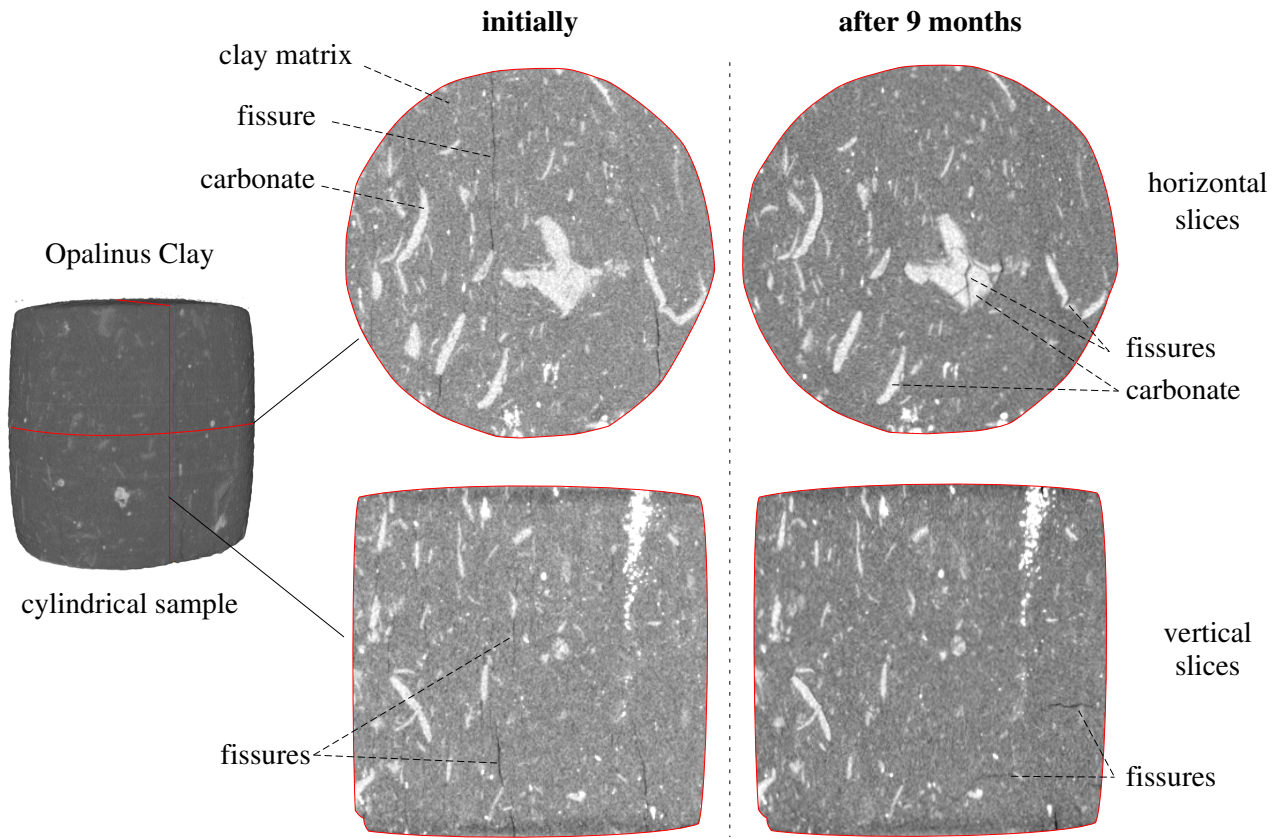


Figure 3: Horizontal and vertical slices of x-ray tomography on the same Opalinus Clay sample with highlighted fissures (in black) under unconfined conditions at its initial state (left) and after 9 months CO_2 exposure (right). The horizontal slices (top) highlight the fissuring of the carbonate phase due to dissolution and the self-sealing of the clay matrix pre-existing fissures under long-term confinement; the vertical slices (bottom) highlight the fissure rearrangement and change of orientation that took place in time.

orientation. After 9 months of CO_2 exposure there are two important observations to be pointed out. First, clear fissures in the carbonate phases have been formed suggesting calcite dissolution for the first time from x-ray images under realistic pressure and temperature conditions. In addition to the fissuring of the carbonate inclusions, a disappearance of the initially pre-existing fissures in the clay matrix is observed.

For a better understanding of the micro-structural modification of the sample after long-term CO_2 exposure, the orientation of the minimum eigenvectors of the moment of inertia is calculated for each identified inclusion and micro-fissure. This corresponds to the longest axis of each labeled inclusion or micro-fissure. The 3D orientations together with their projection in the 2D plane are plotted in Fig. 4. Both types of orientation plots are presented for a better demonstration of the result of each studied phase. The 3D histogram is more comprehensible for the orientation of the cracks and the 2D

278 projection for the inclusions. For this analysis, a bilateral filter has been applied on the two images to
 279 reduce noise and to smoothen the edges between the different phases (clay/cracks, clay/inclusions).
 280 In this way a better segmentation of the phases of interest (cracks and inclusions) can be achieved.

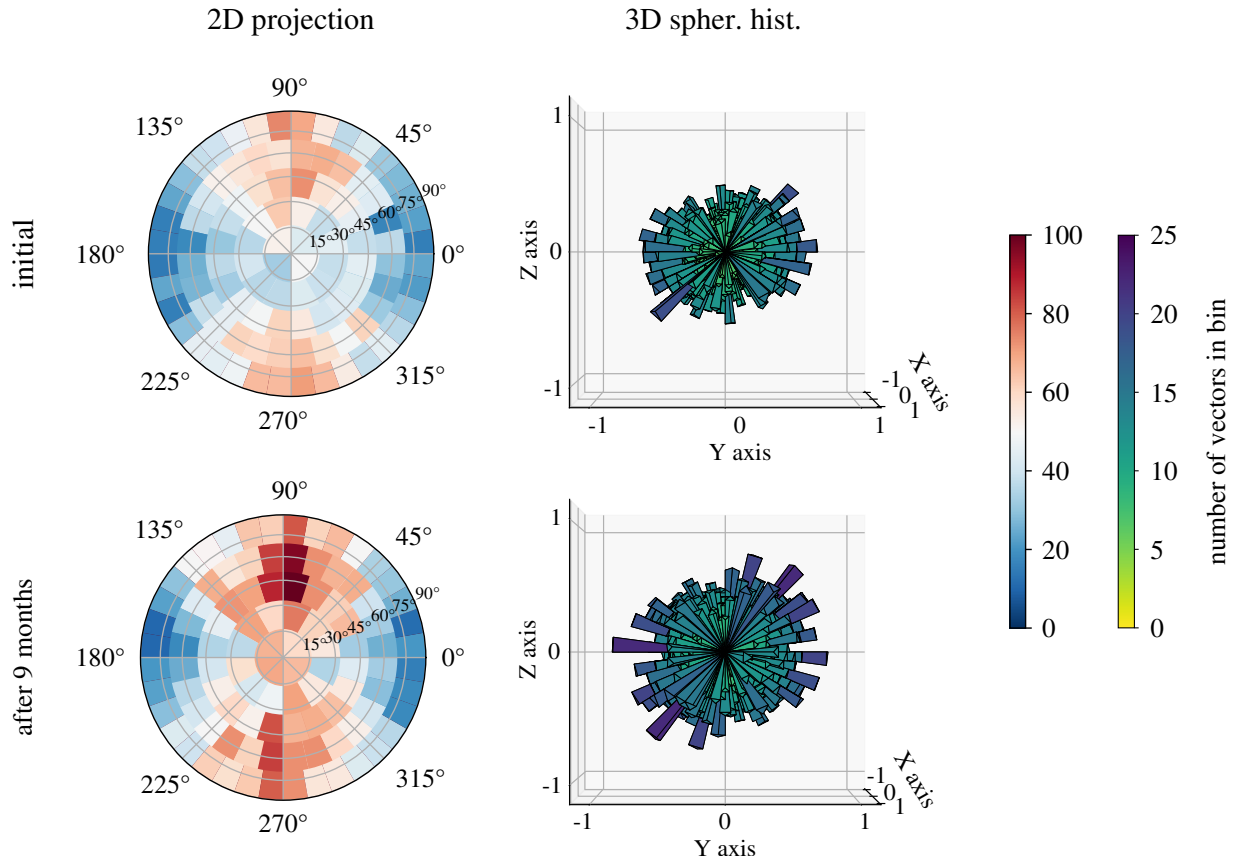


Figure 4: 2D projection (left) and spherical histogram (right) of the minimum eigenvectors of sample 02 inclusions, initially and after 9 months exposure to CO₂

281 The 2D projection of the minimum eigenvectors of the inclusions reveals a preferential orientation
 282 along the vertical axis – i.e. axis parallel to the bedding plane – both initially and after 9 months
 283 exposure (Fig. 4). The vertical axis of the 2D plots is parallel to the Y axis of the spherical histograms
 284 that are plotted in this view to demonstrate the orientation of the eigenvectors on the ZY plane. After 9
 285 months exposure to CO₂ the population of inclusions is increased as demonstrated by both plots at the
 286 bottom of Fig. 4. This increase in the number of inclusions is considered as an indication of carbonate
 287 dissolution that resulted in fissuring of the calcite inclusions and consequently identification of more
 288 numerous inclusion particles. The main orientation axis after dissolution remains vertical, suggesting
 289 that fissuring in the carbonate particles has mainly occurred along their shortest axis and therefore
 290 perpendicularly to the bedding plane.

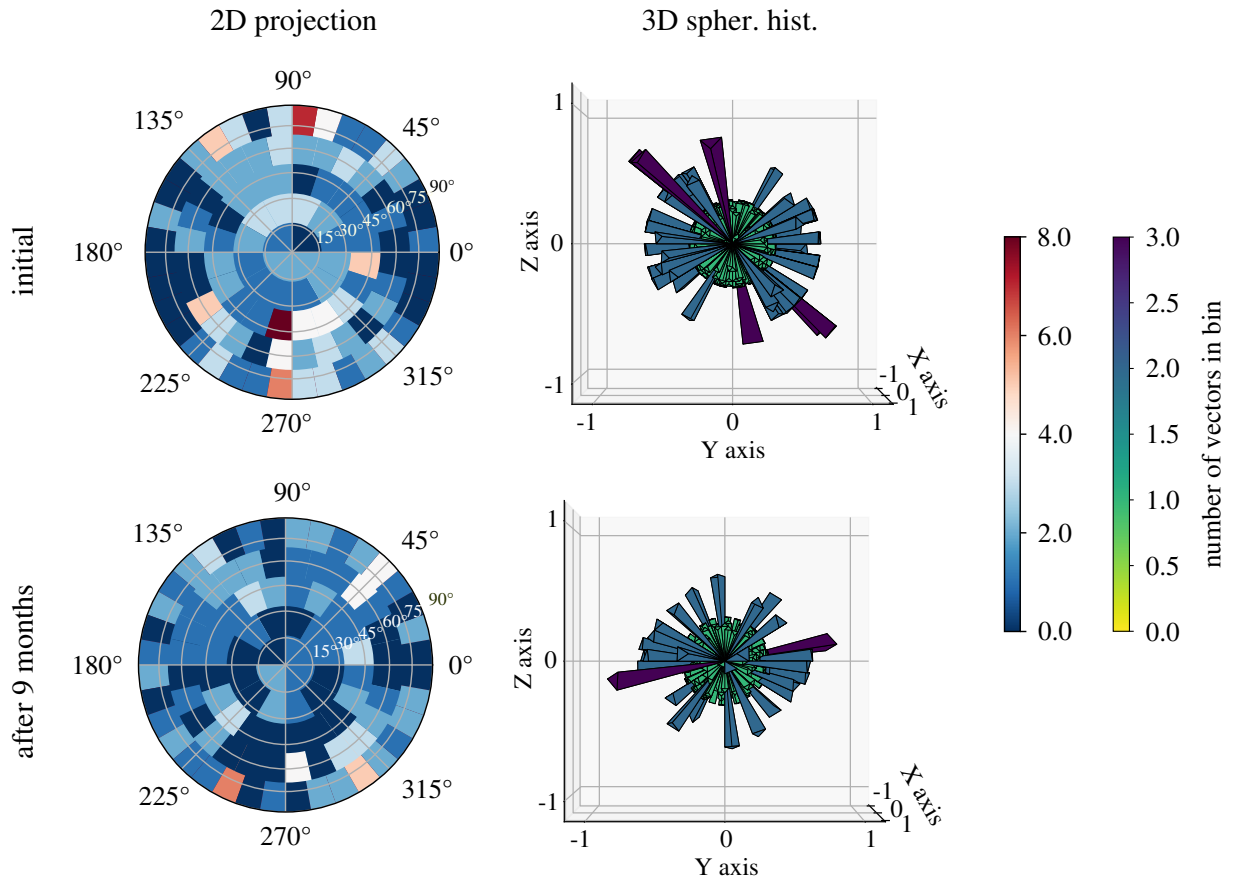


Figure 5: Spherical histogram of the minimum eigenvector of the inclusions and the cracks in sample A, initially and after 9 months exposure to CO₂ (colour represents the number of projected points per bin divided by the median number of points in all bins)

In a similar way, the 2D projection and the spherical histograms of the minimum eigenvector of the identified cracks in the sample are plotted in Fig. 5: initially and after 9 months of CO₂ exposure. The initial shape of the 3D histogram reveals the preferential orientation of the micro-fissures parallel to the bedding plane. This is confirmed by the high number of vectors projected on the vertical axis of the 2D plot. After 9 months of CO₂ exposure, the shape of the 3D crack histogram is modified. On one hand, the number of cracks is reduced, and on the other hand, the orientation of the main pre-existing cracks is no longer parallel to the bedding.

Finally, in the aim of a better visualisation of the texture of the carbonic inclusions, the SEM image of the same (unpolished) slice with Fig. 2 is presented in Fig. 6. For the SEM images, two detectors have been used: (top) a secondary elements detector that basically illustrates the surface topography, and (bottom) a backscattered electrons detector that shows a Z contrast, i.e. lighter elements (such as Si, Al, O, K) are darker and heavier elements (here Ca or C) are brighter. The secondary ele-

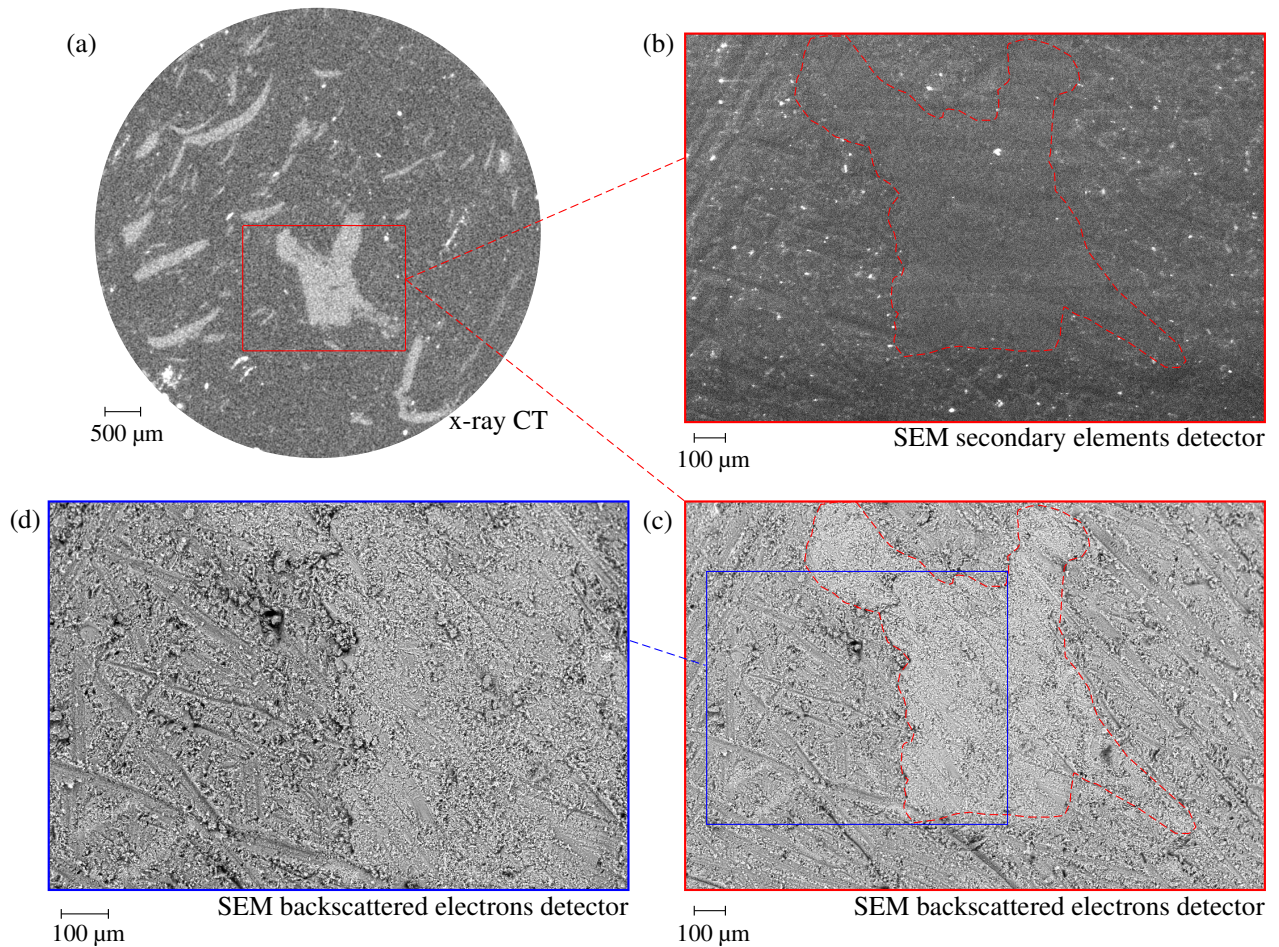


Figure 6: Horizontal slice of the Opalinus Clay sample A from different imaging tools, (a) x-ray computed tomography, (b) corresponding SEM slice scanned with a secondary elements detector, (c) corresponding SEM slice scanned with a backscattered electrons detector, (d) magnified selected region of (c)

ments detector does not reveal any information regarding the targeted inclusion other than the fewer sandpaper traces that are more obvious on the softer clay matrix. On the other hand, the backscattered electrons detector provides a better distinction between the two phases. The higher resolution of SEM allows a better visualisation and understanding of the interface between the carbonate inclusion and the clay matrix that is otherwise not visible from the x-ray images. Even though the resolution is still in the micrometric scale and no nanometric pores can be detected in either types of images, a distinct calcite/clay interface of increased porosity is revealed in the zoomed area of the bottom SEM image (blue window). These results confirm the findings of Minardi et al. (2021) on carbonate rich Opalinus Clay shale that identified a bimodal pore size distribution, with a second dominant pore size between 50-100 μm corresponding to the interface of carbonate/clay particles.

313 **4 Direct exposure to supercritical CO₂**

314 In this part, the interaction of an Opalinus Clay sample with supercritical CO₂ is evaluated in time
315 by means of quantitative 3D x-ray image analysis. Theunjacketed (no membrane) caprock sample
316 is exposed from all sides (equilaterally) to direct contact with supercritical CO₂ at $p = 10$ MPa and
317 $T = 34^{\circ}\text{C}$ pressure and temperature conditions respectively. For the study of its volumetric and micro-
318 structural response regular x-ray scans (resolution $5.38\ \mu\text{m}/\text{px}$) are performed. The water saturated
319 sample is mounted in the PEEKcell and a first scan (00) is performed under ambient unconfined
320 conditions. CO₂ is then introduced in the cell in direct contact with the sample. The target pressure
321 and temperature are applied and maintained stable over a period of 56 days. Further scans of the
322 sample are performed while under pressure in the PEEKcell after 13 days (scan 01), 30 days (scan
323 02) and 56 days (scan 03) of CO₂ exposure. A final scan is performed after the release of pressure
324 and temperature (scan 04 at 56 days).

325 **4.1 Volumetric response**

326 The 3D volumetric response of the caprock material under the above mentioned conditions is evalu-
327 ated and quantified by means of DVC analysis. As explained earlier, to properly compare and analyse
328 the acquired images, the occasional rigid-body transformation (translation and rotation) is removed
329 so that the images are well aligned, as shown in the left column of Fig. 7. The middle vertical slice of
330 the tested sample reveals the pre-existence of 3 principal horizontal fissures parallel to each other and
331 parallel to the bedding orientation of the sample, i.e. perpendicular to the vertical axis of the sample.
332 These micro-fissures with an initial maximum aperture of $\approx 30\ \mu\text{m}$ may have been induced during
333 sample preparation and/or during resaturation under free swelling conditions. Their existence is not
334 necessarily an issue for the given study. On the contrary they can provide important insight into the
335 impact of their presence upon interaction with CO₂. For instance, an increasing opening of the bottom
336 fissure can be observed in time, directly from the x-ray slices in Fig. 7 (left). Moreover, the creation
337 and propagation of additional new micro-fissures at the bottom of the sample can be observed with
338 time, as highlighted in the same slices.

339 For a more quantitative analysis of the localised response of the sample, the volumetric strain
340 is calculated in 3D between each scan and the initial state of the sample (scan 00) that is used as

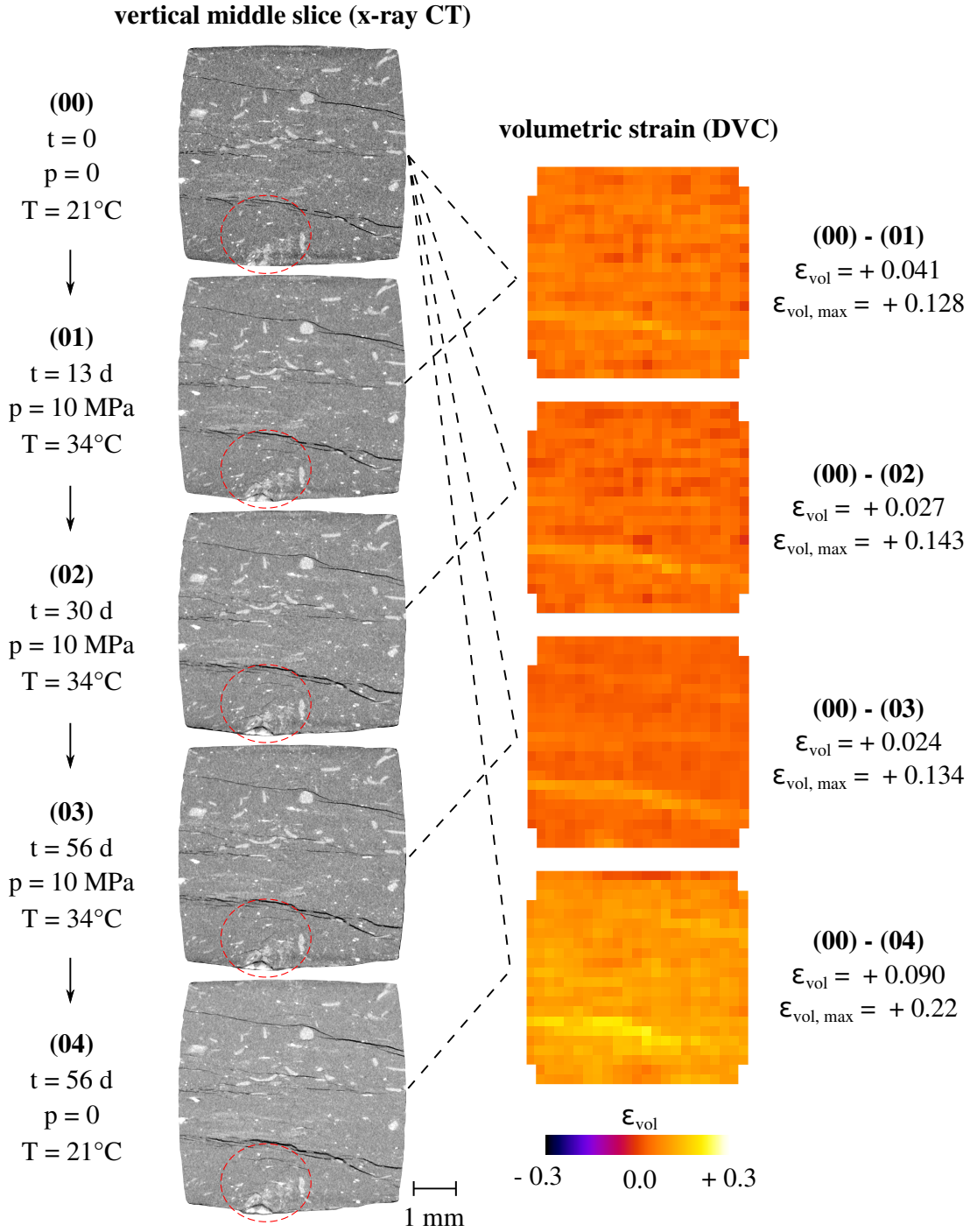


Figure 7: Volumetric response of the Opalinus Clay sample in time after exposure to supercritical CO₂ – left: middle vertical slice of the x-ray CT image with highlighted in red the zone of increased cracking activity, right: corresponding map of volumetric strain from DVC analysis

reference. For the DVC analysis, the chosen parameters (half window size, node spacing etc.) are detailed with the additional provided data online. The map of the calculated volumetric strain of the middle vertical scan slices is presented on the right column of Fig. 7. It must be noted that the reported values of measured volumetric strain, total (ϵ_{vol}) and maximum ($\epsilon_{vol, max}$), correspond to the entire 3D

345 volume. In all scans a more pronounced expansion is measured on the location of the lowest pre-
 346 existing micro-fissure ($\epsilon_{vol,max}$). Only after 2 months of CO₂ exposure (scan 03) a slight expansive
 347 activity may be measured around the othe two pre-existing ones. The overall expansive response of
 348 the sample (positive ϵ_{vol}) is clearly dominated by the expansion of the fissures. A distinct pattern
 349 is absent in the rest of the material, but the calculated volumetric strain reveals an initial expansion
 350 ($\epsilon_{vol00-01} = + 0.041$) that in time reduces ($\epsilon_{vol00-02} = + 0.027$) and stabilises ($\epsilon_{vol00-03} = + 0.024$). Finally,
 351 upon pressure decrease, the material expands in a more pronounced way ($\epsilon_{vol00-03} = + 0.090$), not
 352 only at the lower crack zone but everywhere in the sample due to stress relaxation. These results are
 353 discussed in detail in a following section.

354 4.2 CO₂ uptake

355 The visualisation and quantification of CO₂ penetration in the material is presented in this part,
 356 based on analysis of the GV evolution of the x-ray images after correction for volumetric strain
 357 (Stavropoulou et al., 2020). This approach is quite challenging in the context of CO₂ uptake, since
 358 the density variations due to supercritical CO₂ invasion are very slight (unlike the case of a denser
 359 fluid). This is why normalisation of the GVs is imperative for this kind of analysis (see Appendix).

360 The maps of the GV variation are presented in Fig. 8. A density decrease is observed overall
 361 during the first month of exposure (00-01 and 00-02). Even though these results are somewhat noisy,
 362 a more pronounced density decrease is obtained, at the lower part of the sample where crack initiation
 363 occurs. On the other hand, around the zones of the pre-existing fissures a density increase is measured.
 364 In this case the zones around the fissures are possibly filled in with CO₂. It has to be noted that this
 365 approach is even less accurate around the crack locations. This is because the obtained fields are the
 366 result of the subtraction between the initial least fissured image (00) with a future deformed image
 367 (e.g. 02) that has more fissures. The application of the calculated deformation field on 00 cannot
 368 create these new fissures, and therefore, the density will always be decreased in the direct vicinity of
 369 the fissures (blue).

370 Two months after CO₂ exposure, the overall density of the material increases homogeneously,
 371 if not more noticeably around the lower pre-existing fissure. It is interesting to notice that between
 372 scans 02 and 03 the volumetric activity that was measured is almost negligible. This density increase

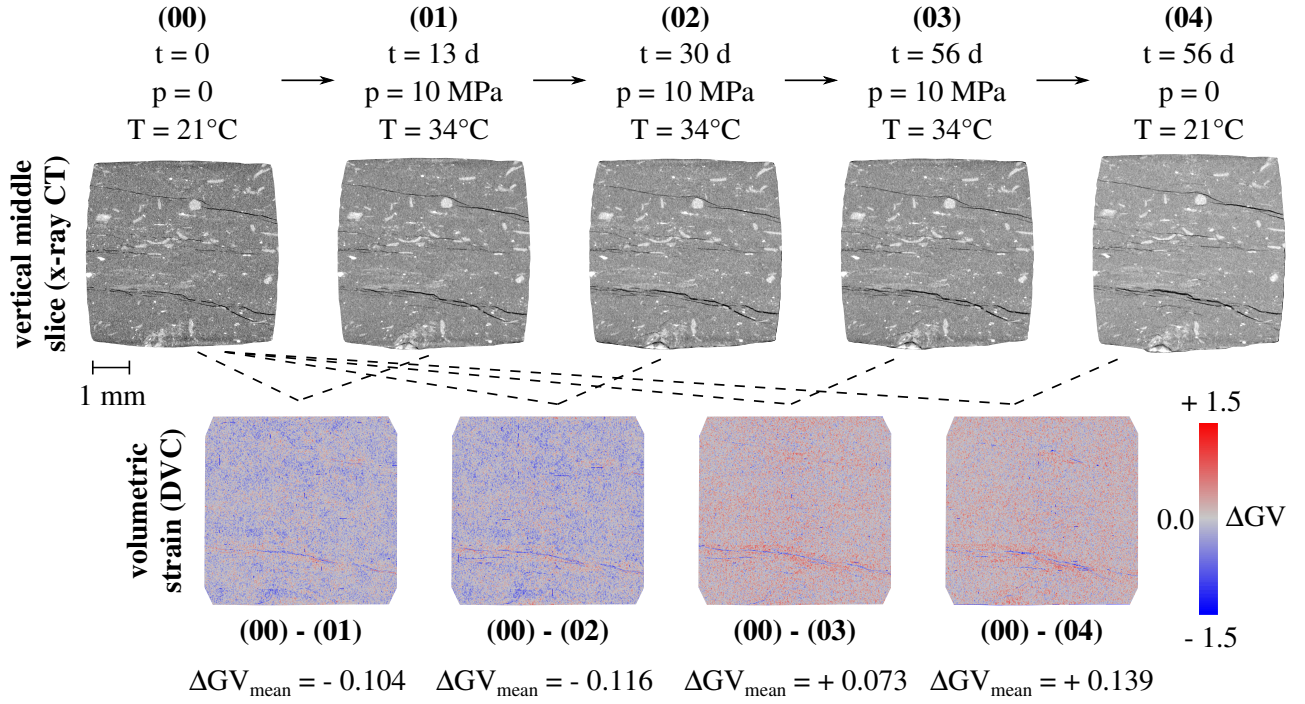


Figure 8: Fields of the grey value changes of the caprock material in time after removing the changes due to volumetric strain – the chosen colourbar represents density (in terms of GV) increase (red) or decrease (blue)

under constant volume reveals the saturation of the material with CO₂. Unlike the previous two fields, here the material seems to be in equilibrium indicating that CO₂ has invaded it in its entirety. Final CO₂ pressure release (00-04) leaves the sample with an overall increased density, in particular at the zones around the fissures and at the bottom. This final result may indicate chemo-mechanical or CO₂ trapping phenomena that occurred during the two months exposure. The different results are discussed in the following section.

5 Discussion

5.1 Long-term CO₂ exposure

Long-duration exposure of Opalinus Clay to CO₂ showed micro-structural modifications, both in the clay matrix and the carbonate zones in the material. When CO₂ is placed in contact with the pore water of the shaly caprock material, it results in acidification of the pore fluid – by means of diffusion – and therefore in alteration of the chemical equilibrium. For instance, pre-existing carbonate crystals might be dissolved by the acidic fluid and enhance the transport properties of the material (Busch et

386 al., 2008; Espinoza et al., 2011; Jia et al., 2018).

387 In this study, the identified cracks in the calcite zones of Opalinus Clay after long-term interaction
388 with CO₂ are associated to dissolution effects. Even though calcite dissolution has not been previously
389 observed to result in fissuring, the fissures in the calcite zones of the material reveal a localised
390 activity within these zones. Calcite dissolution in shales is mainly identified indirectly by post-mortem
391 analysis either of injected fluids or solid samples. In this work, the visualisation of large calcite
392 inclusions allow the observation of micro-structural modifications that occur locally, within the area
393 of interest (i.e. the calcite zones). Possible desaturation of the sample is not likely to explain the
394 creation of these localised fissures, since dessication cracks in shales appear mainly within the clay
395 matrix or at the interface of the clay matrix with other inclusions (calcite, pyrite etc.). Fissuring in the
396 clay matrix is however not observed even after total pressure release (unconfined conditions). On the
397 contrary, the number of pre-existing fissures initially in the sample is reduced. This is additionally
398 ensuring for the potential impact of progressive pressure loss during these 9 months of exposure.
399 Pressure loss may result in desaturation and fissuring of the sample (usually parallel to the bedding
400 orientation) that have not been observed at the given resolution of this study.

401 Fissure closure can be explained by means of hydromechanical self-sealing behaviour of the ma-
402 terial under long-term confinement. The self-sealing response of shales is one of the main properties
403 for which this material is studied as a potential sealing material in a broader context of underground
404 storage, such as radioactive waste, CO₂ or hydrogen storage (Bossart et al., 2019; Di Donna et al.,
405 2022, Yu et al., 2022). Hou et al., (2022) discussed the self-sealing response of caprock materials in
406 terms of mineral precipitation. They showed that in illite-rich shale precipitation took place in quartz,
407 i.e. Si-rich zones. In the current study, Si-rich zones are unfortunately not distinguishable from the ei-
408 ther SEM or x-ray images. Prakash et al., (2022) pointed out a more pronounced precipitation activity
409 in zones parallel to the direction of the bedding plane. This is in line with the identified orientation of
410 fissures in the sample before and after confinement and CO₂ exposure. The pre-existing fissures that
411 were parallel to the bedding orientation disappear, and the fewer fissures after long-term confinement
412 and CO₂ exposure are in their majority no longer parallel to the bedding. Other works have shown that
413 incorporation of supercritical CO₂ in micro-structural interlayers can induce the beneficial swelling
414 of smectitic clays (Alemu et al., 2011; Busch et al., 2016). This aspect is discussed in more detail in

the following section, in association to the measured volumetric response of the material.

Finally, it is not clear whether these new fissures are the result of further chemical reactions due to alteration of the pore fluid's pH, or whether they are related to mechanical impact from previous CO₂ breakthrough (see 3D volumetric response after breakthrough in Stavropoulou and Laloui, 2022). In either case, this result points out a potential rearrangement of the fissure network after long-term CO₂ exposure that has not been previously discussed. Most importantly, these results on the micro-structural modifications show how little we still know regarding the coupled long-term THMC response of the caprock/CO₂ interaction at the micro-scale and their implications to the large scale response. Longer-duration testing under realistic boundary conditions are required for a better understanding of the complex mechanisms that occur.

5.2 THMC response

The volumetric response of Opalinus Clay to direct equilateral exposure of supercritical CO₂ presented an increased activity around the zones of the three pre-existing micro-fissures. First, an overall volumetric expansion was measured (scan 01) resulting from the temperature increase for the application of supercritical conditions, i.e. from ambient 25°C to 34°C. This initial expansion may be additionally related to smectite swelling upon exposure to supercritical CO₂ (Busch et al., 2016). Expansion was then followed by compaction until stabilisation of the volumetric strain in time, with some elevated values around the bottom fissure and the bottom of the sample.

The interpretation of this response is not straightforward since the sample is subjected to complex THMC boundary conditions. In theory, the application of constant pressure equilaterally and directly in contact with a water saturated sample is not supposed to affect the applied effective stress that should remain zero. In other words, since CO₂ is provided equilaterally on the unjacketed sample, the concept of effective stress is not valid, neither is the concept of hydraulic fracturing with the increase of pore pressure, as it is the same with the applied skeleton pressure. However, the presence of pre-existing fissures suggests that the sample is in reality not fully saturated and that matric suction (negative pore pressure) must be present locally in the fissured and partially saturated zones. Upon introduction of high pressure CO₂, suction breakdown occurs locally (decrease of effective stress) and the sample swells until stabilisation at full saturation – water + CO₂. This hydromechanical

interpretation can confirm the initial volumetric activity that eventually stabilises in time. Zhang et al. (2018) have previously addressed evolution of the axial effective stress of partially water saturated montmorillonite upon injection of supercritical CO₂ (10 MPa and 44°). They evaluated the swelling stresses of the material under different levels of confinement and attributed them to expansive smectite response. Otherwise, smectite swelling has been mostly observed under unconfined conditions (Schaef et al., 2012; De Jong et al., 2014; Michels et al. 2015). In this study, the boundary conditions are different but closer to unconfined conditions, with zero effective stress globally but not necessarily locally.

Another important aspect that has been discussed little in the literature is the dessication of the material when in contact with CO₂ (Espinoza and Santamarina, 2010; Miri and Hellevang, 2016; Cui et al. 2021). The pore water of the material evaporates in the anhydrous CO₂ resulting desaturation which can result to further crack opening (expansion) and pore collapse in the clay matrix. Dessication could explain the lower volumetric expansion in time until eventual equilibrium. This little discussed interaction can occur in real field conditions at the bottom of the caprock formation in contact with the buoyant CO₂, leading to partial desaturation of the caprock and threaten its mechanical integrity and sealing capacity.

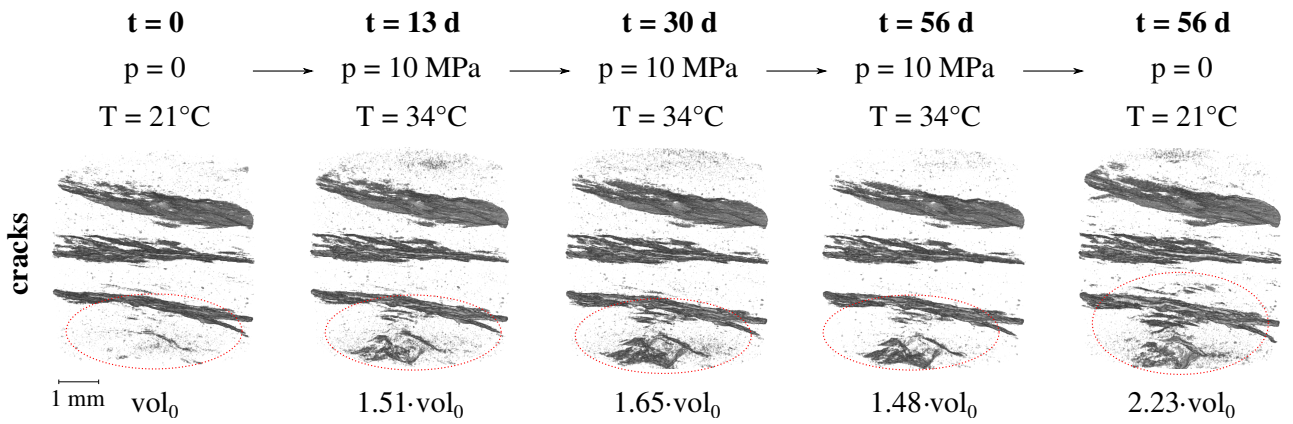


Figure 9: Evolution of pre-existing fissures and appearance of new ones (encircled zones) after direct exposure to supercritical CO₂ (illustration in 3D)

To better understand the impact of the afore mentioned coupled THM mechanisms, the volumetric evolution of the fissures in the different scans is calculated and presented in Fig. 9. For this calculation, the same GV threshold has been used for all the normalised scans. Whereas the volumetric increase of the pre-existing fissures has already been identified from the calculated volumetric maps of the

entire sample, Fig. 9 reveals the creation and propagation of a new family of fissures at the bottom of the sample. These new fissures demonstrate in a clear way the dessication effect of anhydrous CO₂ explained above. Additional chemo-mechanical mechanisms (such as dissolution) may contribute to the initiation of these micro-fissures that are noticeably localised in a calcite-rich area at the bottom of the sample (see x-ray images in Fig. 7). Eventual dissolution aspects are hard to interpret since preferential fissuring patterns in calcite-rich zones may be due to the increased porosity between the calcite interfaces and the clay mineral interface (as shown in Fig. 6).

Phenomena related to pore fluid alteration, e.g. water evaporation in the anhydrous CO₂, alteration of the pore fluid pH due to CO₂ diffusion or eventual invasion of CO₂ in the material, have been addressed by measuring the evolution of the density (GV) of the material in time while accounting for the corresponding volumetric strain. The density decrease that is observed overall during the first month of exposure (see Fig. 8 00-01 and 00-02) can be explained by the desaturation of the sample discussed earlier. Invasion of anhydrous CO₂ in the material partially occurs through water evaporation, therefore the material is filled up with a fluid of lower density. The following density increase, can be attributed to both pore fluid changes and CO₂ uptake in the material. Geochemical interactions between the invading supercritical CO₂ and the solid matrix of the material cannot be easily argued from the obtained results. For example, potential swelling of smectite has already been accounted and corrected in the given density maps and all density changes are related to mass-related changes (uptake or loss). This is a first attempt to visualise CO₂ invasion in a caprock material and even though it is quantitative in terms of GV levels, the physical interpretation in terms of e.g. actual CO₂ volume increase or water decrease requires further studies and measurement for the calibration of GVs of the different phases.

5.3 Implications for geological CO₂ storage

In this work, a series of coupled phenomena that take place in a shaly caprock material have been addressed and discussed based on qualitative and quantitative measurements of 3D x-ray tomography images. The various THMC mechanisms that have been demonstrated, are related to some extent to the equivalent testing conditions: stress state, CO₂ pressure and time exposure, water saturation/dessication, mineral dissolution and precipitation. However, field conditions are different than

these testing conditions. For instance, the levels of effective stress in a CO₂ storage site are much higher, in the order of 10 to 20 MPa (depending on the storage depth). Consequently, the stress state of the material has an impact on the appearance of fissures. The fissures in the calcite-rich zones of the material have been visualised in an unconfined sample state (scan taken after pressure release). Similarly, dessication fissures due to water evaporation in the invading anhydrous CO₂ might not manifest (at the given resolution) under elevated levels of effective stress. However, drying of the caprock due to interaction with undissolved CO₂, is a phenomenon that might take place at the interface between the reservoir and the caprock due to the buoyant tendency of CO₂. Dessication of the caprock can have implications that can threaten the caprock integrity and sealing capacity, for example, facilitate CO₂ breakthrough. The exact CO₂ breakthrough pathway in the caprock is not easy to predict because of the high micro-structural heterogeneity of the material. The connected pore space (including fissures) is supposed to drive flow and breakthrough phenomena, however, the different competing mechanisms (e.g. dessication, local effective stress modification) may result in the collapse of initially conductive pathways and the creation of new ones. There has been previous evidence of such phenomena in gas migration tests (Harrington et al. 2012; Cuss et al., 2014). The results of this study and their interpretation, demonstrate the importance of considering the different localised effects for a better understanding of the long-term response of shales in the context of geological CO₂ storage. Macroscopic or averaged measurements and observations that do not take into account the micro-structural heterogeneity of shales, are limited for the development representative constitutive and numerical models.

6 Conclusions

In this work the interaction between the Opalinus Clay, a caprock representative material, with CO₂ is studied with x-ray tomography imaging. The different results and observations reveal the complex response of this material due to multiple coupled phenomena that occur in parallel. Exposure to supercritical CO₂ implies temperature increase of the material that results in thermal expansion (TM coupling). This expansion leads to inevitable desaturation of the material (TH coupling). At the same time, the live observation of the caprock material in time revealed another important aspect when anhydrous CO₂ is in contact with the water saturated sample. The pore water evaporates in

the anhydrous CO₂ causing further dessication of the material that starts fissuring. Fissures, whether pre-existing in the material or new ones, play an important role on the CO₂/caprock interaction. They drive most of the volumetric and hydraulic phenomena: swelling, desaturation, uptake, breakthrough. In the field, fissures in the caprock formation could be found around the injection wellbore or fault zones, but their impact is still not well understood.

The long-term impact of CO₂ on the micro-structure of a shaly material (the Opalinus Clay) is for the first time visualised with x-ray tomography on a solid sample and under non-extreme temperature and pressure conditions (< 40°C and 10 MPa respectively). Fissuring of calcite-rich zones after 9 months of CO₂ exposure is associated to dissolution-related effects (CM coupling). The mineralogical composition of these denser inclusions in the x-ray images has been confirmed from SEM-EDX measurements. Segmentation and labelling of the inclusions before and after long-duration CO₂ exposure confirmed an increased number of inclusions due to fissuring, the mean orientation of which did not significantly evolve. A similar analysis has been made on the fissure network in the clay matrix of the sample before and after long-term exposure. The principal crack orientation in the sample is initially parallel to the bedding orientation of the shaly material. These fissures close with the application of confinement as shown in Stavropoulou and Laloui, (2022) but do not re-appear 9 months later, after pressure release. This result demonstrates the self-sealing response of Opalinus Clay that can be attributed to a series of mechanisms: long-term hydromechanical loading (HM coupling), expansive smectitic response, mineral precipitation of Si-rich zones (CM couplings). In addition to the closure of pre-existing fissures, the x-ray scan after 9 months revealed the appearance of new micro-fissures in the clay matrix (other than the fissures in the calcite zones), surprisingly in a perpendicular direction to the bedding. This aspect of potential re-arrangement of the fissure network of the material is demonstrated for the first time and could be related to additional chemo-mechanical mechanisms within the clay matrix or related to CO₂ breakthrough that due to self-sealing of the initial micro-fissures initiated a new optimal pathway throughout the sample. The preferential pathway of CO₂ breakthrough is not yet well understood in such heterogeneous microstructures and may induce fissuring of different orientation than the in-situ bedding.

Finally, the CO₂ uptake in the caprock material has been investigated by combining the calculated strain fields and the GV variation of the acquired x-ray images. CO₂ penetration in the sample has

548 been identified two months after initial exposure. It is hard to interpret the multi-phase fluid interac-
 549 tion in the porous space of the material prior to two months due to the multiple THMC phenomena
 550 that take place simultaneously and often counteract each other. It is significant that after CO₂ release
 551 the density of the sample remained increased compared to the initial two months earlier, revealing
 552 potential CO₂ trapping in the material.

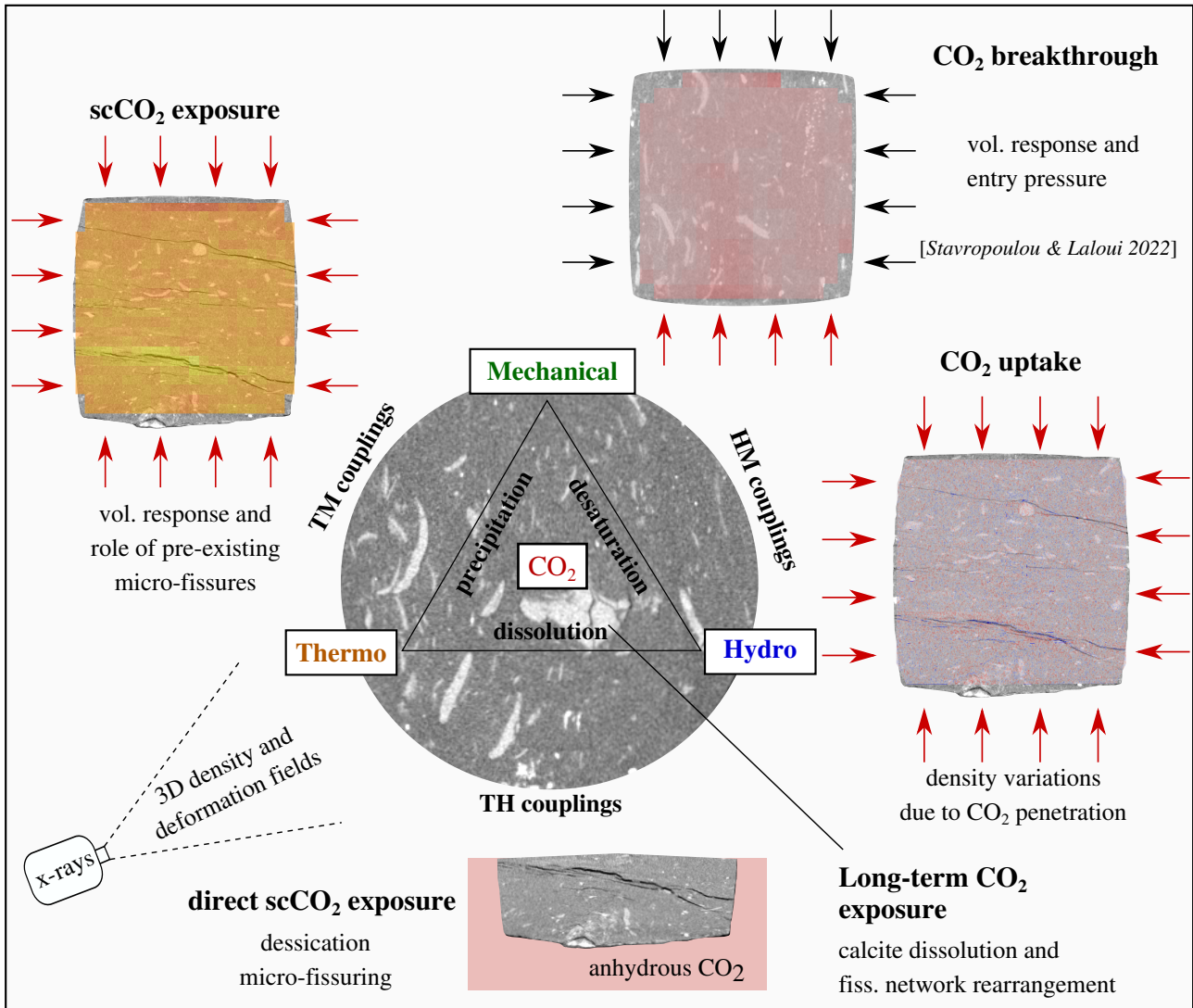


Figure 10: Coupled THMC mechanisms studied with in situ x-ray imaging on small size shale samples

553 Figure 10 highlights the different coupled mechanisms that have been identified in this work to
 554 occur during the CO₂/caprock interaction. These topics require undoubtedly further investigation
 555 with long-term experiments under continuously monitored conditions. Analysis of the response using
 556 a non-destructive tool, i.e. x-ray tomography allows the 3D study of the material locally, in zones
 557 where the different phenomena are prone to occur. For instance, the evolution of calcite inclusions

558 within the sample or sealing of pre-existing fissures in the clay matrix are visualised and quantified
559 locally in the sample, unlike previous studies where such interactions have been discussed from more
560 macroscopic/averaged results. The study of small shale samples has significantly contributed to the
561 better understanding of the various coupled phenomena, first by achieving better time resolutions,
562 and then by studying the response of the material under high spatial resolutions in 3D, revealing
563 mechanisms previously undetectable with conventional testing methods and resolutions. These phe-
564 nomena include the volumetric reponse and water evaporation during exposure to supercritical CO₂,
565 the localised chemo-mechanical interactions in calcite-rich zones, the CO₂ uptake and the role of
566 micro-fissures in the material, and the volumetric response upon CO₂ breakthrough.

567 **7 Data availability**

568 The 3D x-ray images that have been used in this paper are provided online in Zenodo [link TBC].
569 Additional data or results can be provided by the Authors upon reasonable request.

570 **8 Acknowledgements**

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572 wish to thank the PIXE platform (EPFL) for the assistance during the x-ray tomography scans, as
573 well as the Mont Terri laboratory and SwissTopo for providing the tested Opalinus Clay material.

Appendix A: Normalisation of x-ray tomographies

For the analysis of the attenuation evolution of the images, the different scans are normalised using always as reference scan 00. The objective of this normalisation is to set to zero the voxels that correspond to void in order to be able to more reliably detect density variations. The normalisation is performed considering the parts of the image that are not supposed to vary in density with time i.e. PEEK and Aluminium. Since the void attenuation is changing with the introduction of CO₂, the ratio of the greyvalues (GV) between Aluminium, PEEK and air is considered constant as shown in Fig. A1.

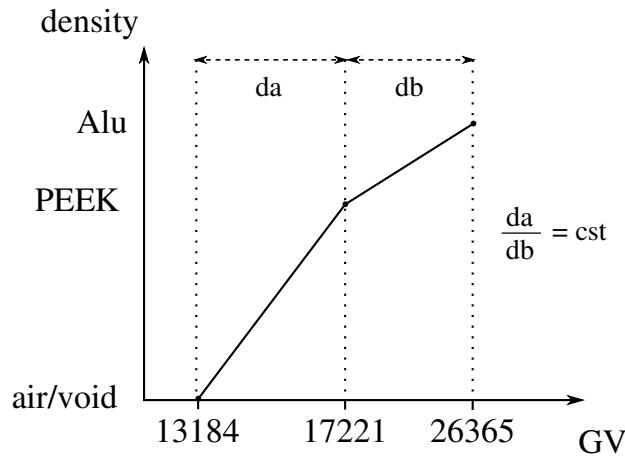
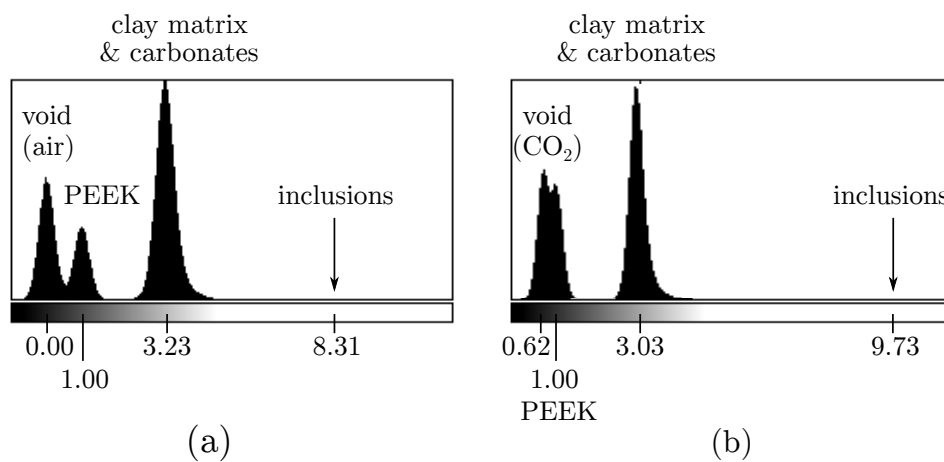


Figure A1: Measured greyvalues as a function of corresponding density in scan 00

GV (32b)	Void	PEEK	Aluminium	da	db	da/db
00	13184 (832)	17221 (833)	26365 (900)	4037	9144	0.44149
01	13113	17195 (841)	26442 (910)	4082	9247	0.44149
02	13191	17237 (839)	26403 (907)	4046	9166	0.44149
03	13450	17330 (613)	26119 (693)	3880	8789	0.44149
04	13445	17287 (602)	25990 (699)	3842	8703	0.44149

Table A1: Measured (normal font) and calculated (bold font) mean greyvalues (and standard deviation/error in the parenthesis) of the parts of the scan that are not expected to vary in density with time for the normalisation of the images

582 This ratio is calculated from the reference scan 00 (first row of Table A1) and considered constant
 583 in order to deduce the air greyvalue of the rest of the scans. The computed GV of air (first column
 584 of Table A1) is then subtracted from each scan, which is then divided by the corresponding PEEK
 585 value so that PEEK average value is 1 for the sake of simplicity. The histogram of scan 00 after
 586 normalisation is shown in Fig. A2-a, while the histogram after CO₂ introduction (scan 003) is changed
 587 to that in Fig. A2-b. The GV normalisation of the different scans can improve the volumetric analysis
 588 (DVC) and it is indispensable for the detection of density variations.



A2: Greyvalues histogram of normalised (a) scan 00 (no CO₂) and (b) scan 01 (with CO₂)

589 Appendix B: Segmentation of the x-ray images

590 The different steps for the segmentation for the different types of phases are illustrated in Fig. B1.
 591 First, a bilateral filter is applied on the original image in order to smoothen the zones of similar
 592 phases and sharpen the edges between different phases (Fig. B1-a).

593 The distributions of the GV levels before and after the application of this filter are plotted in
 594 Fig. B2. A narrower distribution is obtained after the bilateral filter, providing more precision for
 595 the selection of each GV range for the segmentation of the different phases. The resulted segmented
 596 slices of the inclusions and the micro-fissures after the application of a threshold GV range are shown
 597 in Fig. B1-b and c, respectively. In the case of the inclusions, a double cycle of dilation and erosion
 598 of the binary image has been applied in order to reduce noise. This is not possible for a further noise
 599 reduction of the of the fissures segmented image due to their 1 pixel thickness.

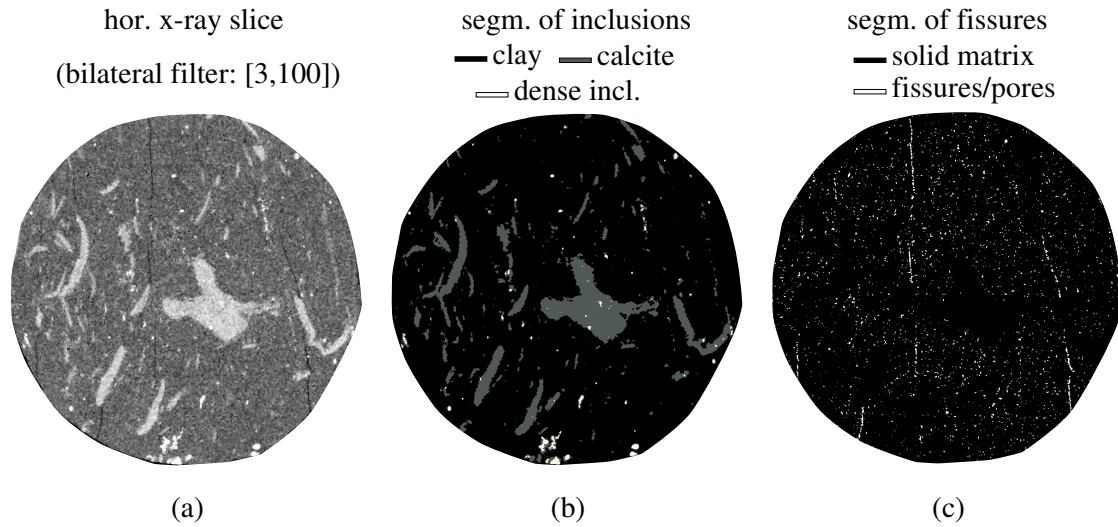
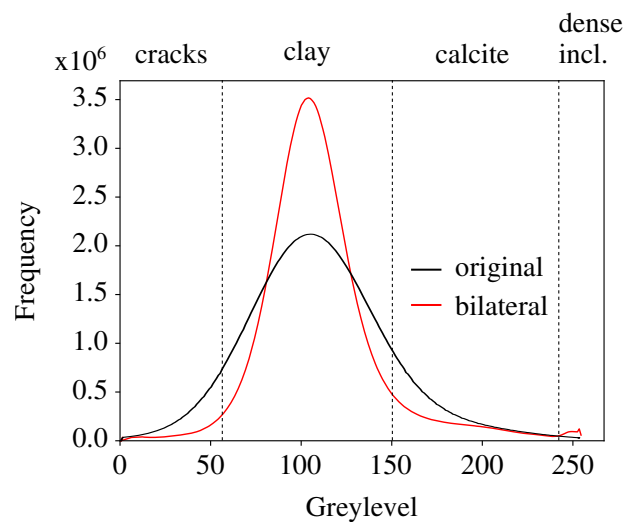


Figure B1: Horizontal slices after the (a) application of a bilateral filter, (b) segmentation of the two types of inclusions (calcite and denser inclusions), (c) micro-fissures



B2: Greyvalues histogram of the original horizontal x-ray slice and after the application of bilateral filter of Fig. B2 (a)

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