**Porosity-Permeability Relationships in Mudstone from Pore-Scale Fluid Flow Simulations using the Lattice Boltzmann Method**

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**Key Points:**

* We develop a model to predict mudstone permeability from clay platelet geometry using lattice Boltzmann simulations
* Modeled porosity-permeability predictions match experimental observations from synthetic and natural mudstones
* Our model can simulate mudstone permeability response to compaction and to fluid injection using porosity and clay mineralogy

**Abstract**

We model mudstone permeability during consolidation and during fluid injection by simulating porous media flow using the lattice Boltzmann method. We define the mudstone structure using clay platelet thickness, aspect ratio, orientation and pore widths. Over the representative range of clay platelet lengths (0.1 – 3 µm), aspect ratios (length/thickness=20-50) and porosities (*φ*=0.07 – 0.80) our permeability results show good correlation with natural mudstone datasets. Homogenous smectite and kaolinite models document a log-linear decline in vertical permeability from 8.31x10-15 m2 - 6.84x10-17 m2 at *φ*=0.73-0.80 to 6.33x10-19 m2 - 1.30x10-23 m2 at *φ*=0.07-0.16, showing good correlation with experimental trends (R2=0.42 and 0.56). We then test our methodology to predict the porosity-permeability character in natural mudstones consisting of smectite, illite and chlorite grains. Over *φ*=0.32-0.58, the porosity-permeability trends of two mudstone models of heterogenous mineralogy match experimental datasets well (R2=0.78 and 0.74). We extend our methodology to evaluate how mudstone permeability might evolve during microfracture network growth or macrofracture propagation upon fluid injection. Fluid injection causing a porosity increase from 0.07 to 0.57 results in a permeability increase from 1.02x10-20 m2 to 9.59x10-15 m2 for growth of a microfracture network, and from 1.02x10-20 m2 to 3.85x10-14 m2 for macrofracture propagation. Our results suggest that the growth of a distributed microfracture network results in greater vertical permeability increase than a single macrofracture upon fluid injection in compacted mudstones (*φ*=0.07-0.36). Our modeling approach provides a simple means to estimate permeability during burial and compaction or fluid injection based on knowledge of porosity and mineralogy.

1. **Introduction**

Mudstone comprises 60-70% of sedimentary basin fill. During burial to 5 km, mudstone porosity (**) decreases from 0.9 to 0.05, which coincides with decline in permeability (*k*) of up to 10 orders of magnitude [Neuzil, 1994]. These variations in permeability are important for several geological applications such as pore pressure development [Lou and Vasseur, 1992], continental slope stability [Dugan and Flemings, 2000], hydrocarbon retention [England et al., 1987], and shale gas production [Soeder, 1988]. Accurate prediction of mudstone permeability, however, remains challenging due to the factors influencing permeability such as grain dimension [Schwartz and Banavar, 1989], platelet orientation [Clennell et al., 1999], and pore geometry [Bowers and Katsube, 2002]. Clay minerals and their dimensions are often suggested as primary controls on mudstone permeability [Olsen, 1962; Dewhurst et al., 1996]. Clay platelet length ranges from 0.1 µm to10 µm [Mondol et al., 2007] and platelets have aspect ratios (length/thickness) of 1 to 100 [Santamarina et al., 2002]. This large variation in grain dimension is suggested as the dominant controlling factor in mudstone permeability spanning 3-4 orders of magnitude for a single porosity value [Dewhurst et al., 1999a; Mondol et al., 2008].

Several models have been proposed to explain mudstone permeability. Many models assume a log-linear relationship between permeability and porosity [Rose, 1945, Nagaraj et al., 1994; Neuzil, 1994], but fail to explain the observed range of mudstone permeability for a given porosity [Yang and Aplin, 2007]. Another model used to predict mudstone permeability is the Kozeny-Carman model [Kozeny, 1927; Carman, 1937], which requires information on tortuosity, pore factor, specific pore surface area, and pore volume. While the Kozeny-Carman relationship can predict the permeability of unconsolidated mudstones with reasonable accuracy [Chapuis and Aubertin, 2003], several studies document prediction errors of several orders of magnitude [Yang and Aplin, 1998; Dewhurst et al., 1999a, b]. In other work, Yang and Aplin [2007] use pore size distribution measurements to develop an empirical power law relationship between mudstone permeability and mean pore throat radius. Thus, while several models exist to predict mudstone permeability, their application requires knowledge of pore size and tortuosity, and do not directly account for the effect of clay platelet geometry.

To improve mudstone permeability characterization, we develop a model that directly includes clay platelet geometry. We employ a three-dimensional, pore-scale model using clay platelet dimensions, pore throat widths, platelet orientation, and porosity. We use this to evaluate the impacts of clay platelet geometry and porosity loss on permeability during burial. We estimate permeability in mudstones of homogenous mineralogy from lattice Boltzman simulations of water flow through mudstone pore structures and validate our results against compilation of experimental and field datasets. We employ our modeling approach to predict porosity-permeability relationships in natural mudstones of heterogenous clay mineralogy and compare our results against experimental datasets. Finally, we extend our model to fluid injection by modifying pore structure to assess how permeability changes with growth of a microfracture network and with propagation of a macrofracture. Thus, with information on clay mineralogy, clay content, and porosity, our new approach can help estimate permeability in mudstones subjected to anthropogenic fluid injection from wastewater disposal, hydraulic fracturing, and carbon sequestration.

1. **Methods**

**2.1. Initial Mudstone Pore Structure**

We build our mudstone models from cuboidal platelets arranged in bedding layers, with each platelet oriented at an angle *θ* from the horizontal [Fig. 1a]. Each clay platelet has a thickness (*β*)and a length and width (*mβ)*, where *m* is the aspect ratio of the clay platelets. Pore space between particles is defined by intrabed pores of a finite width (*ε*) and by interbed pores, each of length and width (*λ*) [Fig. 1a]. To analyze mineralogy-specific porosity-permeability behavior of mudstones, we initially design three homogenous mudstone models using (1) kaolinite particles, (2) smectite particles, and (3) clay particles of intermediate size.

In general, kaolinite particles have a length of 1- 10 µm and aspect ratios up to 25, whereas smectite particles have a length up to 0.1 µm and aspect ratios up to 100 [Mitchell and Soga, 2005]. We simulate kaolinite mudstone starting with *φ*=0.76 (*m* = 20; *mβ =* 3 µm; *ε = λ =* 360 nm). We simulate smectite mudstone starting with *φ*=0.80 (*m* = 50; *mβ =* 0.1 µm; *ε = λ =* 9 nm). We simulate the intermediate mudstone starting with *φ*=0.73 (*m* = 35; *mβ =* 2 µm; *ε = λ =* 137 nm). Our initial mudstone porosity of 0.73-0.80 lies within range of porosity for near-seafloor mud [Daigle and Screaton, 2015; Cook and Sawyer, 2015]. Our initial pore widths of 9-360 nm are consistent with pore sizes determined from scanning electron microscopy and mercury intrusion porosimetry analyses of unconsolidated marine mudstones (1-5000 nm) [Heath, 2010], siliceous mudstones (5-750 nm) [Loucks et al., 2009], and London Clay (10-500 nm) [Dewhurst et al., 1999b].

Mineral grains are oriented randomly at deposition [Bennett et al., 1989]. In contrast, clay platelets in our model are oriented at the same angle with respect to the horizontal, *θ* [Fig. 1a]. Daigle and Dugan [2011] show that a porous medium with uniformly distributed grain orientations between *θ1* and *θ2* can be represented using the mean orientation (*θ*) angle of all grains in the matrix (*θ* = (*θ1*+*θ2*)/2). Clay platelet orientations can range between 0° to 90° from horizontal at deposition (*θ1* = 0°, *θ2* = 90°, *θ*=45°) [Deamer and Kodama, 1990], therefore, we implement an initial platelet orientation of *θ* = 45o in our mudstone models.

**2.2.** **Lattice Boltzmann Simulations**

We use the open source code OpenLB [Latt, 2008] to simulate water flow through mudstone using the lattice Boltzmann method. We choose the lattice Boltzmann method because it has been used successfully to predict the permeability of sandstones [Bosl et al., 1998], to estimate sandstone permeability from thin sections [Keehm et al., 2004], and to model the development of permeability anisotropy in mudstones [Daigle and Dugan, 2011]. Lattice Boltzmann simulations of flow yield fluid flux (*q*) for an applied pressure differential (*ΔP*); conversions between lattice Boltzmann units and SI units are made using guidelines described by Chukwodzie [2011]. For all simulations, we apply a constant pressure differential (*ΔP*) of 88x103 Pa across the model domain in the direction of flow and implement the particle bounce-back scheme [Bouzidi et al., 2001] along the orthogonal edges. Water (dynamic viscosity, *µw* = 8.9x10-4 Pa.s; density, *ρw* = 1000 kg/m3) is used as the permeating fluid. By applying *ΔP* in different directions, we determine vertical water flux (*qv*), horizontal water flux in the plane of platelet rotation (*qh1*) and horizontal water flux orthogonal to plane of platelet rotation (*qh2*). In our study, we focus on horizontal water flux in the plane of platelet rotation (*qh1*), hereafter referred to as *qh* [Fig. 1a].

**2.3. Calculation of Permeability and Tortuosity**

We rearrange Darcy’s law to calculate permeability (*k*) from our simulation results,

, (1)

where *k* is permeability (m2) and *L* is the length (m) over which pressure differential is applied. Vertical permeability (*kv*) is calculated using water flux in the vertical direction (*qv*) and horizontal permeability (*kh*) is calculated using water flux in the horizontal direction (*qh*). Permeability anisotropy is calculated as *kh*/*kv*. To ensure the applicability of Darcy’s Law, we maintain Reynolds Number (*Re = (ρw\*q\* mβ)/µw*) less than 10 for all simulations.

We supplement permeability predictions with calculations of tortuosity (*τ*) to validate our methodology. We adapt the approach of Nabovati and Sousa [2007] to calculate vertical tortuosity (*τv*) and horizontal tortuosity (*τh*),

, (2)

. (3)

**2.4. Mudstone Compaction**

We simulate compaction through simultaneous decline in mudstone porosity and grain orientation [Fig. 1b]. Porosity loss during compaction is simulated through imposed, step-wise reduction of intrabed and interbed pore widths [Table S1]. After compaction our modeled mudstones have pore widths of 1-40 nm, which is consistent with pore throat diameters in compacted mudstones measured by X-ray diffraction and nitrogen gas-adsorption [Katsube and Williamson, 1994; Kuila and Prasad, 2012].

Natural and experimental mudstone compaction document a decline in range of observed grain orientations [Day-Stirrat et al., 2012] and an increase in horizontal bedding character [Aplin et al., 2006]. During compaction we assume a decline in *θ2* from 90° to 0° and *θ1*=0°. We implement a compaction orientation function in our mudstone models through the prescribed decline in representative platelet orientation (*θ* = (*θ1*+*θ2*)/2) from 45o to 0o [Table S1]. In general, the modeled compaction orientation function replicates the increase in horizontal bedding character during compaction in mudstones, observed during natural and experimental compaction. We simulate faster decline in platelet orientation angle at high porosity states in our models [Table S1], consistent with experimental mudstone compaction [Dewhurst et al., 1999a]. Vertical and horizontal permeability is calculated during step-wise compaction of the mudstone models [Table S1].

1. **Compaction Model Results**

In our kaolinite compaction model, *kv* decreases from 8.31x10-15 m2 at ** = 0.76 to 6.33x10-19 m2 at ** = 0.14 [Fig. 2], following a log-linear trend (R2 = 0.99),

. (4)

Simultaneously, *kh* decreases from 1.01x10-14 m2 to 1.43x10-17 m2 [Table S1] and *kh/kv* increases from 1.32 to 22.6 [Fig. 3]. The reduction in vertical permeability during compaction is accompanied by an increase in vertical tortuosity from 1.02 to 2.06 [Fig. S1a] and a decrease in horizontal tortuosity from 6.56 to 1.62 [Table S1].

In our smectite compaction model, *kv* decreases from 6.48x10-17 m2 at ** = 0.80 to 1.30x10-23 m2 at ** = 0.16 [Fig. 2], following a log-linear trend (R2 = 0.99),

. (5)

Simultaneously, *kh* decreases from 1.33x10-16 m2 to 9.35x10-22 m2 [Table S1] and *kh/kv* increases from 1.94 to 71.9 [Fig. 3]. The reduction in vertical permeability during compaction is accompanied by an increase in vertical tortuosity from 1.01 to 2.56 [Fig. S1a] and a decrease in horizontal tortuosity from 8.64 to 1.54 [Table S1].

In our intermediate mudstone compaction model, *kv* decreases from 6.10x10-16 m2 at ** = 0.73 to 1.02x10-20 m2 at ** = 0.07 [Fig. 2], following a log-linear trend (R2 = 0.98),

. (6)

Simultaneously, *kh* decreases from 1.11x10-15 m2 to 4.68x10-19 m2 [Table S1] and *kh/kv* increases from 1.82 to 45.6 [Fig. 3]. The reduction in vertical permeability during compaction is accompanied by an increase in vertical tortuosity from 1.02 to 2.20 [Fig. S1a] and a decrease in horizontal tortuosity from 8.06 to 1.59 [Table S1].

The modeled decreases in *kv* and *kh* during compaction are due to a reduction of pore throat widths. Greater values of *kh* compared to *kv* occur as interbed pores provide greater continuity in pathways for horizontal fluid flow, while clay platelets create a more tortuous pathway for vertical flow. Vertical tortuosity increases while horizontal tortuosity decreases during compaction which amplifies permeability anisotropy [Fig. 3].

1. **Discussion** 
   1. **Validation of Porosity-Permeability Models**

We compare our modeled porosity-permeability relationships with experimental and field mudstone data [Mondol et al., 2008, Neuzil, 1994]. Our kaolinite and smectite models [Eq. 4,5] show good correlation (R2 of 0.42 and 0.56) with experimental data [Fig. 2]. The modeled porosity-permeability relationships lie within range of experimental and natural mudstone datasets, and the intermediate mudstone model [Eq. 6] depicting the bulk compaction-permeability behavior of mudstones [Fig. 2]. These results validate our modeling approach over representative range of grain sizes (0.1-3 µm), aspect ratios (20-50), grain orientations (45o-0o), and porosity (0.80-0.07).

Existing experimental and modeled values for mudstone tortuosity range from 1 to 3.5 as porosity decreases from 0.9 to 0.1 [Iversen and Jørgensen, 1993; Boudreau and Meysmann, 2006]. We calculate values of vertical tortuosity of 1.01-2.56 during compaction [Table S1], which lies within range of reported tortuosity values. The increase in *τv* during compaction is accompanied by a decline in *τh* [Table S1], which is consistent with experimental observations [Dewhurst et al., 1999a]. This provides additional validation of our model approach.

During compaction, our model results also document increasing permeability anisotropy from 1.32-1.94 at *φ*=0.72 – 0.80 to 22.6 – 71.9 at *φ*=0.07 – 0.16 [Fig. 3]. Experimentally determined values of anisotropy in mudstones document an increase from 1.5 to 40 during compaction [Arch and Maltman, 1990; Bhandari et al., 2015; Yang and Aplin, 2007]. Over *φ*=0.80 – 0.15, predictions of *kh*/*kv* from our mudstone models lie within range of experimentally documented mudstone anisotropy values [Fig. 3]. At porosity less than 0.15, when *θ*=0° in our models, our smectite and intermediate mudstone models predict *kh*/*kv* of 71.9 and 45.6, which exceeds the range of experimental mudstone anisotropy. This overprediction of *kh*/*kv* is due to the simplified horizontal layering of platelets when *θ*=0°. This results in horizontally continuous interbed pores and overprediction of *kh*, resulting in higher anisotropy values. While these *kh*/*kv* values lie outside experimentally observed anisotropy values, several field-scale studies infer *kh*/*kv* >100 based on basin-scale models [Freeze and Cherry, 1979; Garven and Freeze, 1984; Bolton et al., 2000; Day-Stirrat et al., 2008]. Our models suggest that high bedding character resulting in lateral continuity of interbed pores could explain the larger *kh*/*kv* values inferred from analysis of natural flow systems. Thus, for compaction from *φ*=0.80 to 0.07, our methodology of simulating flow through modeled mudstone pore structures provides good estimates of permeability, permeability anisotropy, and tortuosity for homogenous mudstones. While our results from homogenous mudstones lie within range of observations from natural mudstones [Fig. 2], they do not describe the porosity-permeability character of mudstones of heterogenous clay mineralogy so we our validated methodology against data from natural mudstones of known and heterogeneous clay mineralogy.

* 1. **Permeability Prediction in Natural Mudstones**

We test our modeling approach against the porosity-permeability character of two natural mudstones from the Ursa Basin, Gulf of Mexico [Long et al., 2009]. Sample 1324C-1H-1 has a clay mineral weight fraction of 70.4%, consisting dominantly of smectite and illite [Table 1]. Sample 1324B-7H-7 has a clay mineral weight fraction of 68.9%, consisting dominantly of smectite, illite, and chlorite [Table 1]. To simulate the porosity-permeability behavior of these two samples, we model permeability with clay platelets of heterogenous dimensions.

We adapt our model to include mineral weight fractions of smectite, illite, and chlorite to simulate the mudstone pore structures of samples 1324C-1H-1 and 1324B-7H-7 [Text S1; Fig. S2]. For our models, we assume smectite platelets have an aspect ratio (*m*) of 50 and a length (*mβ*) of 0.1 µm, illite platelets have *m*=20 and *mβ*= 2 µm [Santamarina et al., 2012], and chlorite platelets have *m*=25 and *mβ*= 2.5 µm [Weber et al., 2014]. To model sample 1324C-1H-1, we simulate mudstone pore structure *NM1* consisting of 81.5% smectite and 18.5% illite. To model sample 1324B-7H-7, we simulate mudstone pore structure *NM2* consisting of 30.6% smectite, 41.7% illite, and 27.7% chlorite.

Permeability data from the constant rate-of-strain consolidation experiment on sample 1324C-1H-1 document a decrease in vertical permeability from 1.08x10-17 m2 at *φ* = 0.58 to 5.39x10-19 m2 at *φ* = 0.46 [Long et al., 2008]. Magnetic susceptibility analyses document a range of 0° to 15° for platelet orientations at 51.3 mbsf, corresponding to the burial depth of sample 1324C-1H-1 [Yamamoto and Sawyer, 2012]. X-ray diffraction analyses reveal that degree of preferred platelet orientation at 51 mbsf is approximately double of observations at seafloor [Day-Stirrat et al., 2012]. Additionally, Day-Stirrat et al. [2012] record an increase in preferred horizontal orientation with consolidation at IODP Site 1324. Based on this, we assume *θ1*=0° and *θ2*=30° at deposition, and *θ2* approaches 0° as compaction increases. Thus, we simulate compaction of mudstone model *NM1* with uniform representative grain orientation (*θ* =(*θ1+θ2*)/2) declining from *θ*=15° at ** = 0.72 to *θ*=0° at ** = 0.32. During compaction of *NM1* model, *kv* decreases from 1.54x10-16 m2 at ** = 0.72 (*θ* =15°) to 7.09x10-21 m2 at ** = 0.32 (*θ* = 0°) [Fig. 4], following a log-linear trend (R2=0.99),

. (7)

Simultaneously, *kh* decreases from 1.39x10-15 m2 to 2.66x10-19 m2 [Table S2] and *kh/kv* increases from 8.97 to 37.59. The reduction in vertical permeability during compaction is accompanied by an increase in vertical tortuosity from 1.74 to 3.69 and a decrease in horizontal tortuosity from 1.73 to 1.47 [Table S2].

Permeability data from the constant rate-of-strain consolidation experiment on sample 1324B-7H-7 show a decrease in vertical permeability from 1.61x10-17 m2 at *φ* = 0.50 to 3.95x10-19 m2 at *φ* = 0.33 [Long et al., 2008]. Magnetic susceptibility analyses document a range of 0° to 12° for platelet orientations at 60.6 mbsf, corresponding to the burial depth of sample 1324B-7H-7 [Yamamoto and Sawyer, 2012]. X-ray diffraction analyses reveal that degree of preferred platelet at 60.6 mbsf is approximately double of observations at seafloor [Day-Stirrat et al., 2012]. Since horizontal bedding orientation increases with consolidation at IODP Site 1324 [Day-Stirrat et al., 2012], we assume *θ1*=0° and *θ2*=24° at deposition, and *θ2* approaches 0° as compaction is simulated. Thus, we simulate compaction of mudstone model *NM2* with uniform representative grain orientation (*θ* =(*θ1+θ2*)/2) decreasing from *θ*=12° at ** = 0.58 to *θ*=0° at ** = 0.25. During compaction of *NM2* model, *kv* decreases from 3.11x10-17 m2 at ** =0.58 (*θ*=12°) to 4.79x10-20 m2 at ** =0.25 (*θ*=0°) [Fig. 4], following a log-linear trend (R2=0.99),

. (8)

Simultaneously, *kh* decreases from 2.27x10-16 m2 to 1.51x10-18 m2 [Table S2] and *kh/kv* increases from 7.29 to 31.6. The reduction in vertical permeability during compaction is accompanied by an increase in vertical tortuosity from 1.29 to 3.66 and a decrease in horizontal tortuosity from 2.23 to 1.47 [Table S2].

Our modeled porosity-permeability trends for *NM1* and *NM2* shows good agreement with experimental consolidation datasets (R2 = 0.78 and 0.74). In particular, the slopes of porosity-log permeability trends described by models *NM1 and NM2* (Eq. 7 and Eq. 8 respectively) are very similar to the experimental trends described by Long et al. [2008] [Fig. 4].

Over *φ*=0.46 – 0.58, Eq. 7 underestimates the permeability of sample 1324C-1H-1. While model *NM1* is simulated using clay platelets, sample 1324C-1H-1 also has 15 wt.% quartz, 8.6 wt.% plagioclase, and 6.0 wt.% calcite [Long et al., 2008]. Similarly, over *φ*=0.33 – 0.50, Eq. 8 underestimates the permeability of sample 1324B-7H-7. While model *NM2* is simulated using clay platelets, sample 1324B-7H-7 also contains 17 wt.% quartz, 9.2 wt.% plagioclase, and 4.8 wt.% calcite [Long et al., 2008]. Our modeled results predict lower permeability of natural samples as they do not account for the presence of sand, silt and marl, which have been shown to have a permeability-enhancing effect in mudstones [Yang and Aplin, 2010; Dewhurst et al., 1999a; Schneider et al., 2011]. However, over *φ*=0.25-0.72 our model results exhibit good capability to predict the permeability of natural mudstones with high clay weight fraction. In addition to simulating experimental values of vertical permeability, our models also provide an estimate of horizontal permeability, permeability anisotropy, and tortuosity. Thus, our methodology of simulating flow through mudstone pore structures provides a simple way to make first-order predictions of mudstone permeability based on clay composition and dimensions. We extend the developed methodology to understand the evolution of permeability during fluid injection in compacted mudstones.

**5. Permeability During Fluid Injection**

**5.1. Modeling Fluid Injection in Mudstones**

Anthropogenic activities such as wastewater disposal, hydraulic fracturing, and carbon sequestration involve injection of large fluid volumes into the subsurface, which can increase vertical mudstone permeability by several orders of magnitude [Soeder, 1988]. The increase in vertical permeability from fluid injection has been attributed to the growth of microfracture networks [Slatt and O’Brien, 2011] and propagation of macrofractures [Mayerhofer et al., 2006]. We extend our methodology to understand the permeability response of compacted mudstone systems to fluid injection. The compacted, intermediate mudstone with ** =0.07 and *kv* of 1.02x10-20 m2 (*θ*=0°), is used as the starting model for fluid injection simulations. Using lattice Boltzmann simulations, we calculate evolution of vertical permeability for (a) growth of microfracture network [Fig. 5a] where we simulate preferential dilation of intrabed pores during fluid injection [Table S3] and (b) macrofracture propagation [Fig. 5b] where we simulate the increase in macrofracture width during fluid injection [Table S4]. Following the approach we employed in our compaction analysis, we also evaluate the log-linear relationship between vertical permeability and porosity in mudstones during fluid injection.

**5.2. Permeability Evolution upon Fluid Injection**

As interbed pore throats (*εmf*) [Fig. 5a] increase from 11.42 nm to 1154 nm in the microfracture network model, vertical permeability *kvmf*) increases from 1.02x10-20 m2 at *φ* = 0.07 to 9.59x10-15 m2 at *φ* = 0.57 [Fig. 6], following the trend (R2 = 0.88),

.  (9)

This vertical permeability increase is accompanied by a decrease in vertical tortuosity from 2.2 to 1 [Fig. S1b].

As the macrofracture width (*εfrac*) [Fig. 5b] increases from 11.42 nm to 6297 nm, vertical permeability (*kvfrac*) increases from 1.02x10-20 m2 at *φ* = 0.07 to 3.85x10-14 m2 at *φ* = 0.55 [Fig. 6], following the trend (R2 = 0.93),

.  (10)

This vertical permeability increase is accompanied by a decline in vertical tortuosity from 2.2 to 1 [Fig. S1b].

**5.3. Comparison of Permeability Evolution in Fluid Injection Models**

To compare the relative contribution of fracture flow to increases in mudstone permeability, we calculate the effective fracture width at each step of simulated fluid injection. Effective fracture width for growth of microfracture network (*εeffmf*) and macrofracture propagation (*εefffrac*) are calculated as

, (11)

, (12)

where *nmf* is the number of microfractures simulated in our model (*n*=3) and *εi* is the pore throat width of the starting model (*εi=*11.42 nm).   
Over *φ=*0.10-0.36, we calculate greater values of  *kvmf* than  *kvfrac* [Fig. 6]. Simultaneously, *εeffmf* increases from 137 nm to 1370 nm [Table S3], *εefffrac* increases from 366 nm to 2780 nm [Table S4] and we calculate *τvmf* < *τvfrac* [Fig. S1b]. This indicates that the growth of distributed microfracture network results in faster decrease in vertical tortuosity despite lower effective fracture width compared to a single macrofracture, resulting in *kvmf* > *kvfrac*. Over *φ=*0.10-0.36, we calculate greater values of  *kvfrac* than *kvmf* [Fig. 6]. Simultaneously, *εeffmf* increases from 1370 nm to 1890 nm [Table S3], *εefffrac* increases from 2780 nm to 3430 nm [Table S4] and we calculate *τvfrac< τvmf* [Fig. S1b]. The crossover of vertical permeability trends coincides with tortuosity in the macrofracture model becoming lower than tortuosity in the microfracture network [Fig. S1b]. Over *φ=*0.41-0.57, we calculate greater values of  *kvfrac* than *kvmf* and the rate of increase in vertical permeability declines in both models [Fig. 6]. Simultaneously, *εeffmf* increases from 1890 nm to 3430 nm [Table S3], *εefffrac* increases from 3430 nm to 6290 nm [Table S4] and we calculate *τvfrac* **≈** *τvmf* **≈ 1.**

Our models suggest that injection occurs in low porosity mudstones, the growth of a distributed microfracture network yields a greater vertical mudstone permeability compared to propagation of a macrofracture. This is consistent with several experimental, numerical, and field scale studies record greater increase in mudstone permeability upon distributed fracture growth compared to a wide macrofracture [Backeberg et al., 2017; Dahl et al., 2015; Matthäi and Belayneh, 2004]. Recent experiments show that productivity of shale gas wells increases with the use of micro-proppants (1-50 μm) compared to typical proppants (100-300 μm) due to greater permeability enhancement provided by microfractures of smaller width [Calvin et al., 2017]. Our models show that the growth of a distributed microfracture network results in faster decrease in tortuosity of the representative mudstone volume despite lower effective fracture width compared to a single macrofracture.

Our results indicate that as porosity increases upon fluid injection, the macrofracture yields greater vertical mudstone permeability than a microfracture network as the macrofracture becomes wide enough to conduct the bulk of fluid flux. However, wide fractures resulting in representative mudstone volume porosities greater than 0.3 have not been observed in the subsurface due to high fracture opening pressures [Fisher et al., 2002]. Our results suggest that over realistic porosities in compacted mudstones (*φ*<0.3) the growth of a distributed microfracture network yields greater permeability increase than a single macrofracture. Thus, our modeling approach can be used to understand mudstone permeability response to fracture geometries. This predictive capability can help design injection strategies during anthropogenic activities such as hydraulic fracturing, wastewater disposal, and carbon sequestration.

**5. Conclusions**

We develop a simple model that predicts mudstone permeability by simulating fluid flow through pore structures using the lattice Boltzman method. We validate our model against porosity-permeability observations and extend the methodology to predict how permeability changes during fluid injection. Our model represents mudstones as an assemblage of cuboidal grains with thickness (*β*), aspect ratio (*m*), orientation (*θ*) and with intrabed (*ε*) and interbed (*λ*) pore widths. Compaction models for three homogenous mudstones spanning the representative range of clay platelet lengths (0.1 – 3 µm) and aspect ratios (20-50) document a variation in mudstone permeability of over 3 orders of magnitude. Compaction of homogenous smectite and kaolinite models document log-linear declines in vertical permeability from 8.31x10-15 m2 – 6.84x10-17 m2 at *φ*=0.73 - 0.80 to 6.33x10-19 m2 - 1.30x10-23 m2 at *φ*=0.14 - 0.16, showing good correlation with experimental datasets (R2=0.42 and R2=0.56). Additionally, modeled trends of permeability and tortuosity from compaction of homogenous mudstone models lie within range of experimentally observed values on natural mudstones. We advance our validated methodology to predict the porosity-permeability character of natural mudstones with heterogenous clay mineralogy. Over porosity of 0.32-0.58, the porosity-permeability trends described by our heterogenous mudstone models consisting of smectite, illite, and chlorite platelets (models *NM1* and *NM2*) show good correlation with experimental datasets (R2=0.78 and R2=0.74).

We extend our methodology to permeability during fluid injection in compacted mudstone due to (1) growth of a microfracture network where *kv* increases from 1.02x10-20 m2 at *φ* = 0.07 to 9.59x10-15 m2 at *φ* = 0.57 and to (2) propagation of a macrofracture where *kv* increases from 1.02x10-20 m2 at *φ* = 0.07 to 3.84x10-15 m2 at *φ* = 0.55. We document that a distributed microfracture network results in greater mudstone permeability at lower mudstone porosities (0.07 – 0.36) despite lower effective fracture width, whereas a macrofracture yields greater permeability at higher porosity (0.36 – 0.57) once the macrofracture becomes wide enough to conduct the bulk of the fluid flux. In conclusion, we develop an approach to simulate mudstone permeability during compaction or fluid injection using a simple inputs of clay platelet type (mineralogy), platelet geometry (thickness and aspect ratio) and pore throats (porosity). Thus, our model can be used to evaluate fluid flow in mudstone during geological processes or anthropogenic activities.

**Acknowledgements**: This work has been funded in part by fellowships to Harsh Biren Vora from the Department of Earth, Environment and Planetary Science, Rice University. Computing facilities were made available through the Center for Computational Geophysics. The authors benefitted from discussions on numerical modeling with Dr. Julia Morgan. Modeling results and information can be obtained in supporting information and at https://figshare.com/projects/LBM\_Mudstone\_k/58655.

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Table 1: Clay mineralogy of reference samples for mudstone porosity-permeability behavior. Data from [Long et al., 2008].

|  |  |  |
| --- | --- | --- |
|  | Sample: 1324C-1H-1 | Sample: 1324b-7H-7 |
| Core Top (mbsf) | 51.1 | 60.3 |
| Initial Porosity | 0.59 | 0.51 |
| Clay Mineral Fraction (wt. %) | 70.4 | 68.9 |
| Smectite (wt. %) | 82.1 | 27.3 |
| Illite (wt. %) | 17.9 | 38.8 |
| Chlorite (wt. %) | Trace | 25.0 |
| Quartz (wt. %) | Trace | 8.8 |
| Consolidation Experiment | CRS 799 | CRS 015B |

**Figure Captions**

**Figure 1:** (a) Schematic of initial mudstone structure built from clay platelets (grey cuboids) using inputs of platelet thickness (*β*) and aspect ratio (*m*) and intrabed (*ε*) and interbed (*λ*) pore throat widths and orientation angle with respect to horizontal (*θ*). Flux of fluid in vertical and horizontal direction are represented by *qv* and *qh* respectively. (b) Mudstone structure after compaction simulated by reduction in pore throat widths, *ε* and *λ*, and platelet orientation angle (*θ*).

**Figure 2:** Porosity-vertical permeability model results (symbols) and best-fit lines during compaction for kaolinite, smectite, and intermediate mudstone models. Modeled porosity-permeability trends show good correlation with natural and experimental mudstone permeability compilation [Neuzil, 1994] and experimental data on kaolinite and smectite [Mondol et al., 2008].

**Figure 3:** Permeability anisotropy (*kh/kv*) exhibits an inverse correlation with porosity (*φ*) and platelet size (*mβ*) during compaction of kaolinite, smectite and intermediate mudstone models.

**Figure 4:** Porosity-permeability predictions (symbols) and best-fit lines during compaction of heterogenous mudstone models *NM1* (replicating mineralogy of sample 1324C-1H-1) and *NM2* (replicating mineralogy of sample 1324B-7H-7). Modeled porosity-permeability trends of *NM1* and *NM2* lie within range of mudstone permeability compilation [Neuzil, 1994], and show good correlation with experimental data on natural mudstones 1324C-1H-1 (Experiment CRS799) and 1324B-7H-7 (Experiment CRS015B) respectively [Long et al., 2008].

**Figure 5:** (a) Schematic of a microfracture network in compacted intermediate mudstone model during fluid injection. In our model microfracture width increases from 11.42 nm to 1154 nm [Table S3] (b) Schematic of macrofracture through compacted intermediate mudstone model during fluid injection. In our model, macrofracture width increases from 11.42 nm to 6297 nm [Table S4].

**Figure 6:** Porosity-vertical permeability model predictions (symbols) and best-fit lines during fluid injection accommodated through prescribed growth of microfracture network or propagation of a macrofracture. Upto *φ*=0.36, growth of microfracture network (*kvmf*) results in greater permeability increase than macrofracture propagation (*kvfrac*). Beyond *φ*=0.37, *kvfrac* > *kvmf* as the macrofracture becomes wide enough to conduct the bulk of fluid flux. Mudstone permeability compilation [Neuzil, 1994] shown for reference.