Screening Out Reactivity-Promoting Candidates for $\gamma$-Ca$_2$SiO$_4$ Carbonation by First-Principles Calculations

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$\gamma$-Ca$_2$SiO$_4$ as a promising carbonation-activated cementitious material features an attractive capacity of carbon sequestration. Improving the carbonation reactivity of $\gamma$-Ca$_2$SiO$_4$ is of great significance for its practical application. In this paper, first-principles calculations are performed to single out the potential candidates for carbonation activation from a series of dopants. Electronic structure analyses reveal that the carbonation reactivity is related to the reactive site distribution and the binding strength of $\gamma$-Ca$_2$SiO$_4$ crystal. Ba, P, and F elements are found to decrease the overall binding strength of $\gamma$-Ca$_2$SiO$_4$ crystal, which benefits the dissolution of ions from the crystal to take part in the carbonation reactions. The theoretical conjectures are validated by designed and previous experiments, which confirms the first-principles-based method to effectively guide our experimental investigation.

Keywords: $\gamma$-dicalcium silicate, carbonation, reactivity, electronic structure, first-principles

INTRODUCTION

Exploiting effective ways to suppress the carbon dioxide level of the atmosphere is one of the most important scientific issues, which mainly includes two aspects: reducing carbon dioxide emissions and capturing carbon dioxide. Regarding the former, taking the cement industry as an example, the production of cement contributes about 7% of anthropogenic carbon dioxide emissions (Liu et al., 2015), mainly derived from the calcination and decomposition of limestone (one of the main raw minerals). The two main components of ordinary Portland cement clinker are $\beta$-dicalcium silicate ($\beta$-Ca$_2$SiO$_4$, also belite) and tricalcium silicate (Ca$_3$SiO$_5$, also alite). Belite has a lower Ca/Si ratio than alite and requires a lower calcination temperature, which means manufacturing belite causes less energy consumption and carbon dioxide emissions. Thus, in recent years, experts in the cement field have been pushing the use of high belite content cement (compared to the composition of ordinary Portland cement clinker) (Ludwig and Zhang, 2015). However, belite has a much lower hydration reactivity than alite leading to slower development of the early strength of concrete (Scrivener et al., 2015), making it difficult to meet the needs of most practical projects.

On the other hand, regarding capturing carbon dioxide, the use of geological minerals to sequester carbon dioxide has long been an attractive topic in geological science (Olajire, 2013). Olivine minerals such as fayalite (Fe$_2$SiO$_4$), forsterite (Mg$_2$SiO$_4$), etc. are widely investigated as the candidates for carbon sequestration (Olsson et al., 2012; Todd Schaef et al., 2012). The Fe and Mg ions in olivine can be substituted by Ca ions without destroying the symmetry of the
The olivine Ca$_2$SiO$_4$ that belongs to the orthorhombic crystal system is also one of the polymorphs of belite (β-Ca$_2$SiO$_4$), known as γ-dicalcium silicate (γ-Ca$_2$SiO$_4$) (Naa et al., 2015). Previous studies have shown that among common olivine minerals, γ-Ca$_2$SiO$_4$ has a significantly dominant surface water absorption capacity (Kerisit et al., 2013), suggesting the potentially high carbonation reactivity. Besides, compared with the polymorph β-Ca$_2$SiO$_4$, γ-Ca$_2$SiO$_4$ also showed much higher carbonation reactivity (Chang et al., 2016). Mu et al. (2019) found that the γ-Ca$_2$SiO$_4$ samples exposed to a 100% carbon dioxide environment under high pressure achieved mechanical properties in hours equivalent to that of the hydration product of a cement clinker hydrated for days, which provides a perspective of using carbonation-activated cementitious materials to reduce the dependence on alite- and belite-based cementitious materials. Theoretically, the use of γ-Ca$_2$SiO$_4$ carbonation instead of cement clinker hydration not only reduces the carbon dioxide emissions from clinker production but also sequesters the released carbon dioxide in a natural way, i.e., mineralization (Ashraf, 2016). However, the trace amount of carbon dioxide in the air does not allow γ-Ca$_2$SiO$_4$ to achieve a high degree of carbonation in a short time. Apart from the pre-carbonation process under carbon dioxide-rich conditions (Mu et al., 2018), the carbonation reactivity of γ-Ca$_2$SiO$_4$ needs to be improved. To this end, this article aims to select dopant ions that can theoretically increase the carbonation reactivity of γ-Ca$_2$SiO$_4$ through first-principles calculations.

Previous researches tried to reveal the carbonation mechanism of olivine minerals from the perspective of surface reactions. For example, Watson et al. (1997) studied the stability of seven low-index surfaces of forsterite and found that the (1 0 0) surface was the most stable one. De Leeuw et al. (2000) computed the associative and dissociative adsorption of water on the low-index surfaces of forsterite. They found that all surfaces, except the non-dipolar (1 0 0), were favorable for dissociative adsorption while the (1 0 0) surface was preferable for associative adsorption. Kerisit et al. (2013) revealed that calico-olivine (γ-Ca$_2$SiO$_4$) featured the largest adsorption energy (absolute value) among five olivine minerals, namely, forsterite, calico-olivine, tephroite, fayalite, and Co-olivine. These thermodynamic computations regarding the surface adsorption, dissolution, nucleation, and so on are conducive to understanding some steps of the carbonation process of olivine. However, they did not give a general indicator to predict the carbonation reactivity, and the performed thermodynamic calculations (like dissolution energy barrier) (Morrow et al., 2009) are too sophisticated to be used as indicators for singling out reactivity-promoting candidates from numerous dopant species. Herein, we are trying to find a simplified way to roughly give hints to our experiments for searching reactivity-promoting
candidates for $\gamma$-Ca$_2$SiO$_4$ carbonation, which is actually like the machine learning using simple indicators to screen out potential materials for desirable properties. We first analyzed the electronic structures of $\gamma$-Ca$_2$SiO$_4$ to reveal the latent relationship between electronic structures and carbonation reactivity, based on which the potential influence of 10 kinds of doping ions on $\gamma$-Ca$_2$SiO$_4$ was estimated. Promising doping candidates were singled out, and the theoretical conjectures were verified by experiments.

**MATERIALS AND METHODS**

The pristine $\gamma$-Ca$_2$SiO$_4$ crystal structure (Udagawa et al., 1980) was obtained from the inorganic crystal structure database (ICSD). The primary cell of $\gamma$-Ca$_2$SiO$_4$ contains 28 atoms (8 Ca, 4 Si, and 16 O atoms). To reduce the concentration of doped ions, a supercell of $2 \times 1 \times 2$ was adopted as the matrix of doping models. We selected 10 common impurity ions of olivine as substituent ions: Mg, Sr, Ba, Al, Fe, Zn, P, F, Cl, and Br. As shown in Figure 1, according to the similarity of chemical properties, the anions F, Cl, and Br are supposed to replace the O ions in $\gamma$-Ca$_2$SiO$_4$, whereas the cations replace the Ca ions (Mg, Sr, Ba, Zn) or Si atoms (P). Since the Fe and Al ions can replace both the Ca ions and Si atoms as reported in previous researches (Manzano et al., 2011; Durgun et al., 2012), we calculated the two substitution methods for Fe and Al doping.

The Vienna Ab initio Simulation Package (VASP) (Kresse and Furthmüller, 1996; Kresse, 1999) was used to optimize the crystal structure through energy minimization with the conjugate gradient method. The constructed models were continuously optimized until the energy differences and the force differences were less than $10^{-5}$ eV/atom and 0.005 eV/Å, respectively. Then, the electronic structures were calculated and analyzed by the Cambridge Sequential Total Energy Package (CASTEP) (Clark et al., 2005). The exchange-correlation potential was estimated by the Perdew–Burke–Ernzerhof (PBE) method (Blöchl, 1994; Perdew et al., 1994) for both the VASP and CASTEP calculations. In addition, the projector augmented plane wave (PAW) method was implemented in the VASP calculation. A kinetic energy cutoff of 580 eV was adopted based on multiple tests as posted in the Supplementary Material S1. More computational details can be found in our previous studies (Tao et al., 2018a, 2019a).

To verify the doping effects on carbonation reactivity, corresponding experiments were implemented. $\gamma$-Ca$_2$SiO$_4$ was synthesized at 1400°C using the analytical reagent Ca(OH)$_2$. The density of states (A) and local charge density distribution of the valence band maximum (B) and conduction band minimum (C) of pure $\gamma$-Ca$_2$SiO$_4$. The green, orange, and red spheres are Ca, Si, and O atoms, respectively. The blue translucent electron clouds represent the orbitals of energy band edges.
and SiO₂. Cationic dopants (Mg²⁺, Al³⁺, Ba²⁺, P⁵⁺) were introduced into the raw mix in the form of oxides while anionic dopant F⁻ was in the form of CaF₂. The dopant dosage was 2 mol% relative to the molar content of γ-Ca₂SiO₄ in the reference (undoped) group. The fabricated pure and doped specimens were ground into powders with a particle size smaller than 74 µm. For each group to be carbonated, 10 g of γ-Ca₂SiO₄ powder was mixed with 1.5 g water and compacted into cylindrical tablets, which were put into the carbon dioxide atmosphere (purity = 99.9%) for 3 days without extra pressure. We use the degree of carbonation (DOC) of γ-Ca₂SiO₄ to indicate the carbonation reactivity of different doping models. DOC was defined as

\[
\text{DOC} = \frac{m_{\text{real}}}{m_{\text{theo}}} \times 100\%
\]

where \(m_{\text{theo}}\) and \(m_{\text{real}}\) are the theoretically maximal and real uptake of CO₂ respectively. \(m_{\text{theo}}\) can be estimated by the carbonation reaction equation as follows:

\[
\text{Ca}_2\text{SiO}_4 + 2\text{CO}_2 H_2O \rightarrow 2\text{CaCO}_3 + \text{SiO}_2(\text{gel})
\]

The details about the materials preparation and testing procedures can be attained by consulting our previous study (Mu et al., 2018, 2019).

**RESULTS AND DISCUSSION**

**Electronic Structures of Pristine γ-Ca₂SiO₄**

To understand the effects of doped ions on the carbonation reactivity of γ-Ca₂SiO₄, we first need to uncover the relationship between the electronic structures of the pure γ-Ca₂SiO₄ phase and its carbonation reactivity. Previous studies indicate that the carbonation reaction of γ-Ca₂SiO₄ requires water and involves the dissolution and migration of Ca ions from the crystal. Hence, mapping the reactive sites in the γ-Ca₂SiO₄ crystal and measuring the strength of the chemical bonds are essential for the analysis of carbonation reactivity. We calculated the energy band edge structures and bonding structures of γ-Ca₂SiO₄ as illustrated in Figures 2, 3. Figure 2A is the partial density of states (PDOS) and the total density of states (TDOS) of γ-Ca₂SiO₄. The dashed line locates the highest occupied molecule orbital of the system (known as the valence band maximum or VBM), which is also set as the position of relative Fermi level. The closest TDOS peak above the Fermi level implies the lowest unoccupied molecule orbital of the system (known as the conduction band minimum or CBM) (Parr and Yang, 1984; Chattaraj, 2009). The VBM and CBM are separated by a large energy band gap (about 4.2 eV) because the pure γ-Ca₂SiO₄ crystal is a typical insulator. The VBM is the most vulnerable part of the system to lose electrons. Therefore, those species whose atomic energy level contributes to the VBM are the areas in the system that are most vulnerable to an electrophilic attack, i.e., electrophilic reactive sites. Correspondingly, the CBM is the most vulnerable part of the system to accept electrons, pointing to the nucleophilic reactive sites of the system (Manzano et al., 2009; Wang et al., 2015). Figures 2B, C visualize the local charge density (LCD) distributions of pure γ-Ca₂SiO₄ at the VBM and CBM, respectively. The blue translucent electron clouds indicate the electrophilic and nucleophilic reactive sites of the system, respectively. The electrophilic reactive sites are almost entirely on O atoms, which is consistent with the result of the PDOS (left inset of Figure 2A) as the VBM is predominantly contributed by the O 2p state. In contrast, the nucleophilic reactive sites are the regions surrounded by Ca ions, which is also understandable because the CBM is mainly contributed by the 4s and 3d states of Ca atoms (right inset of Figure 2A).

The local charge density distribution of the energy band edges (VBM and CBM) qualitatively visualized the reactive sites of the pure γ-Ca₂SiO₄ crystal, while the binding strength of ions in the system can be quantitatively estimated by the bond length (BL)-bond order (BO) analysis (Figure 3). The BO is obtained by calculating the degree of overlap of the electron cloud between two bonding atoms, which directly reflects the strength of the bond: the larger the BO, the stronger the bond.
(Dharmawardhana et al., 2013; Tao et al., 2018b). Therefore, the BO quantifies the difficulty of extracting ions from the crystal, which is related to the carbonation reactivity. It should be noted that there are a variety of methods of calculating the BO, and the Mulliken scheme (Mulliken, 1955) is adopted here. Although the absolute values of the BO calculated by different methods are different, it is reasonable to compare the relative magnitude of the BO calculated from the same system with the uniform method. The BL also indirectly maps the strength of chemical bonds, that is, the larger the bond length, the weaker the bond. Compared to the correlation of the BO and bond strength, the BL and bond strength are not strictly correlated. As shown in Figure 3A, the Si–O bonds in [SiO$_4$] tetrahedra are almost equal in length (around 1.66 Å), while their BO is clearly distinguished. The BL of Ca–O bonds varies widely from 2.31 to 2.48 Å, whereas their BO is around 0.12 (Figure 3B). Therefore, the BO is an effective indicator for measuring the binding strength of ions in a crystal, suggesting the difficulty of dissolving them from the crystal.

**Reactivity Modification by Doping**

Having revealed the correlation between the carbonation reactivity of pure $\gamma$-Ca$_2$SiO$_4$ and its electronic structures, we now can evaluate the doping effect on the carbonation reactivity by monitoring the changes in the electronic structures of the doped $\gamma$-Ca$_2$SiO$_4$. Figures 4, 5 depict the changes of LCD distribution of the VBM and CBM, indicating the electrophilic and nucleophilic reactive sites, respectively, as aforementioned. Compared with the undoped $\gamma$-Ca$_2$SiO$_4$ in Figures 2B,C, the anionic substitution (F, Cl, Br) significantly changes the electrophilic reactive site distribution (VBM). It is mainly because the substitution of F, Cl, or Br for O changes the effective charge of O ions, causing the shift of the original electrophilic reactive sites from O ions. For the Fe doping, both the electrophilic and nucleophilic reactive sites shifted from O ions and the Ca-blocked regions to the vicinity of Fe impurity. Previous studies have explained that this is due to the strong delocalization of the Fe 3$d$ electron shell, almost spanning the Fermi level, which can lose or accept electrons easily (Tao et al., 2019b). Therefore, Fe ions become the new electrophilic and nucleophilic reactive center of the system. The substitution of Mg, Sr, and Ba for Ca causes less influence on the reactive sites as they come from the same family, namely the IIA group, sharing a similar valence electron structure. Compared with the diffuse distribution of reactive sites in the pure $\gamma$-Ca$_2$SiO$_4$, a slight local enhancement of some...
reactive sites (forming reactive center) is conducive to improving the overall reactivity. However, too strong localization of the reactive sites results in a significant decrease in the number of reactive sites, thereby reducing the overall reactivity. The difficulty lies in how to quantitatively measure the weight of these two aspects.

As discussed in the analysis of pure $\gamma$-Ca$_2$SiO$_4$, the BO can map the potential reactivity of ions from the perspective of their

**FIGURE 5** | The local charge density distribution of the conduction band minimum of doped $\gamma$-Ca$_2$SiO$_4$ crystals. The green, orange, red, and black spheres are Ca, Si, O, and dopant atoms, respectively.

**FIGURE 6** | Total bond order density of the doped $\gamma$-Ca$_2$SiO$_4$ crystals relative to the pure $\gamma$-Ca$_2$SiO$_4$. 
binding strength in the system, which is an easy method to quantify. Therefore, we calculated the BO of Si–O and Ca–O bonds for different doping models and used the changes in the total bond order density (TBOD) to evaluate the doping effect (Dharmawardhana et al., 2016):

\[ TBOD = \sum_{i}^{N} \frac{B(i)}{V} \]

where \( N \) is the number of bonds in the model and \( B(i) \) is the bond order of the \( i \)-th bond. \( V \) is the crystal volume. Figure 6 shows the changes in the TBOD for different doped systems compared to the pure \( \gamma\text{-Ca}_2\text{SiO}_4 \). The TBOD of pure \( \gamma\text{-Ca}_2\text{SiO}_4 \) as a reference (set to unity) is marked in red in the figure. The tabulated data of the TBOD can be found in Supplementary Material S2. It should be noted that for the Al and Fe doping, the TBOD is an average of the two substitution schemes, that is, an arithmetic average of the TBOD of Ca site and Si site substitutions. The TBOD comprehensively considers the doping effect on Si–O and Ca–O bonds and the crystal volume. The smaller the TBOD, the weaker the overall binding strength of the system, and the more likely the crystal is to decompose by ion attacks, implying the potentially high carbonation reactivity. In this regard, it can be observed that some ion doping (Ba, P, F, Cl, Br) is conducive to improving the reactivity of \( \gamma\text{-Ca}_2\text{SiO}_4 \), whereas some ions (Mg, Al, Fe, Zn) induce the opposite effect, and the rest (Sr) causes negligible influence. The theoretical reasoning is tested by experiments discussed in the following section.

**Experimental Verification**

In order to verify the theoretical prediction of the doping effect based on the TBOD analysis, we experimentally tested the carbonation reactivity of different ion-doped systems. Due to the limitation of experimental conditions, here we only conducted tests for some representative ions: Mg, Al, Ba, P, and F. Figure 7 compares the carbonation degree of \( \gamma\text{-Ca}_2\text{SiO}_4 \) with five different ion-doping schemes. Comparing Figure 7 with Figure 6, our theoretical predictions are generally consistent with the experimental results. The theoretically predicted reactivity promoting ions Ba, P, and F indeed accelerated the \( \gamma\text{-Ca}_2\text{SiO}_4 \) carbonation, and the predicted reactivity inhibiting ions Mg and Al retarded the carbonation reaction. Moreover, Mu et al. (2018) studied in detail the Ba doping effect on the carbonation reactivity of \( \gamma\text{-Ca}_2\text{SiO}_4 \). They found that Ba doping significantly increased the carbonation degree of \( \gamma\text{-Ca}_2\text{SiO}_4 \). Although Mu and colleagues speculated from the macroscopic point of view that Ba doping modifies the surface structure, which improves carbon dioxide penetration, our calculations provide a different perspective from the electronic structure modification: Ba doping reduces the overall binding strength of \( \gamma\text{-Ca}_2\text{SiO}_4 \) crystal, making ions easier to dissolve and participate in the carbonation reaction. Therefore, based on our and previous experimental verifications, the theoretical method we proposed is effective to give qualitatively reliable results, which expedites exploring the activation methods of \( \gamma\text{-Ca}_2\text{SiO}_4 \) carbonation.

**CONCLUSION**

In this paper, the potential relationship between the carbonation reactivity of \( \gamma\text{-Ca}_2\text{SiO}_4 \) and its electronic structures is investigated by the first-principles calculations. By monitoring the changes in the electronic structures of \( \gamma\text{-Ca}_2\text{SiO}_4 \) by different doping schemes, the candidates for reactivity promotion are screened out and validated by experiments. If the carbonation reaction of \( \gamma\text{-Ca}_2\text{SiO}_4 \) is regarded as a typical ion attack reaction, the electrophilic reactive sites of \( \gamma\text{-Ca}_2\text{SiO}_4 \) are the O ions while the nucleophilic reactive sites are the Ca-blocked regions. Anionic doping strikingly changes the electrophilic reactive sites, whereas the ionic substitutions that happened within the same main group scarcely modify the reactive site distribution. Doping also changes the binding strength of ions in \( \gamma\text{-Ca}_2\text{SiO}_4 \) crystals, which affects the dissolution rate of ions in the carbonation reactions. For this reason, the total bond order density was proposed as an indicator to estimate the changes in binding strength to further predict the effect of different ion doping on the \( \gamma\text{-Ca}_2\text{SiO}_4 \) carbonation reactivity. This theoretical study provides novel perspectives of the carbonation reactivity of \( \gamma\text{-Ca}_2\text{SiO}_4 \) and accelerates the experimental modification of \( \gamma\text{-Ca}_2\text{SiO}_4 \).

**DATA AVAILABILITY STATEMENT**

All datasets generated for this study are included in the article/Supplementary Material.

**AUTHOR CONTRIBUTIONS**

YT designed and performed the research and wrote the manuscript. YM performed the experimental part of the research.
WZ and FW discussed and analyzed the data. All authors contributed to the article and approved the submitted version.

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**SUPPLEMENTARY MATERIAL**

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fmats.2020.00299/full#supplementary-material

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**Conflict of Interest:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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