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# Essential amino acid carbon isotope ratios as indicators of marine macrophyte response to environmental variation

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**Introduction:** The carbon isotope ratios ( $\delta^{13}\text{C}$ ) of essential amino acids (EAAs), including valine, leucine, isoleucine, threonine, and phenylalanine, in producers are crucial for explaining food-web structures in marine ecosystems. However, few studies have tested the variability of  $\delta^{13}\text{C}$ -EAA values in marine macrophytes, such as seagrass and macroalgae, under changing environmental conditions.

**Methods:** In this study, we examined the responses of  $\delta^{13}\text{C}$ -EAA values in macrophytes to environmental changes and explored their usefulness in characterizing macrophyte groups and local environments. We tested seagrass and macroalgae collected at different spatial and temporal scales in the field, as well as lab-cultured *Ulva* algae at various temperature gradients (12°C, 20°C, and 27.5°C) with additional nitrogen sources.

**Results:** We found that  $\delta^{13}\text{C}$ -EAA values in macroalgae were significantly altered by seasonality and the interactive effects of temperature and nitrogen addition in comparison with mean-centered  $\delta^{13}\text{C}$ -EAA values (normalized  $\delta^{13}\text{C}$ -EAA values relative to the mean of the overall EAAs). The  $\delta^{13}\text{C}$ -EAA values detected in macroalgae within a local environment correlated with those of a co-occurring grazer, *Caprella*. Based on mean-centered  $\delta^{13}\text{C}$ -EAA values, macrophyte groups were distinguishable from other group (i.e., the bacteria group) even under diverse environmental conditions. Moreover, the seagrass group did not overlap with the green and the brown macroalgal group, but overlapped considerably with the red macroalgal group.

**Discussion:** These results suggest that the macrophyte-specific mean-centered  $\delta^{13}\text{C}$ -EAA values may be fairly consistent across broad spatial and temporal scales. Despite significant variation in  $\delta^{13}\text{C}$ -EAA values, the consistency in mean-centered  $\delta^{13}\text{C}$ -EAA values among specific macrophyte groups provides valuable insight into the characteristics of local trophic bases in regions under pressure from dramatic environmental changes.

## KEYWORDS

compound-specific isotope analysis, physiological ecology, biomarker, trophic base, seaweed, producer, climate change

## 1 Introduction

Marine macrophytes such as macroalgae (D'archino and Piazzini, 2021) and seagrass (Stockbridge et al., 2020) provide habitat for other marine organisms. They also play crucial roles in regulating nutrient cycles, particularly those involving carbon and nitrogen, within marine environments. Macrophyte populations often need to adapt to various environmental stressors, such as land-use alterations, climate change, and eutrophication. These stressors disrupt the fundamental physiological processes of native macrophytes, affecting benthic communities and facilitating the proliferation of opportunistic and fast-growing species. Such changes can induce cascading effects on benthic food webs and species interactions (Lovelock et al., 2020; Carrier-Belleau et al., 2021; Velázquez-Ochoa et al., 2022). Due to their ecological importance and susceptibility to environmental change, researchers have monitored the physiological responses of these macrophytes for understanding the dynamics of marine ecosystems (D'archino and Piazzini, 2021; Liénart et al., 2022).

Stable isotope ratios within producers are signals of biochemical and ecological responses to environmental conditions (Deniro and Epstein, 1978; Dawson et al., 2002). Carbon isotope ratios ( $^{13}\text{C}/^{12}\text{C}$  or  $\delta^{13}\text{C}$ ) in producers vary according to factors such as photosynthesis activity, carbon source availability ( $\text{CO}_2$  and  $\text{HCO}_3^-$ ), pH, temperature, light, and availability of inorganic N and P (Cohen and Fong, 2006; Park et al., 2016; Kang et al., 2021; Velázquez-Ochoa et al., 2022). Due to their sensitivity to spatial and temporal environmental fluctuations, the isotopic composition of bulk tissues in producers is commonly utilized as isotopic baselines that reflect local environments. However, these isotope values are also influenced by additional factors, such as taxonomy distinctions, reproductive or growth stages, tissue types, and morphological characteristics of macrophytes (Kim et al., 2014; Stephens and Hepburn, 2014; Park et al., 2016; Velázquez-Ochoa et al., 2022). Previous studies have reported significant shifts of between 3% and 5‰ in bulk isotope values of macrophytes *in situ*, encompassing seagrasses (e.g., Kim et al., 2014; Park et al., 2016) and macroalgae (Stephens and Hepburn, 2014; Drobnitch et al., 2018; Zuñiga-Rios et al., 2021; Liénart et al., 2022), over times and in natural field conditions. Nevertheless, bulk isotope analyses can introduce uncertainty due to the substantial influence of both environmental disturbances and the physiological status of producers (e.g., Mancinelli and Vizzini, 2015; Casella et al., 2022). Consequently, although bulk isotope ratios can provide insights into physiological changes in macrophytes within changing environments, their application to understanding impacts on ecosystems has been limited.

Carbon stable isotope values of individual compounds, such as free and protein-bound amino acids (AAs) in producers, can be powerful tools for assessing physiological, biochemical, and ecological processes. Several proteinogenic AAs, including valine (Val), leucine (Leu), isoleucine (Ile), threonine (Thr), phenylalanine (Phe), and lysine (Lys), are synthesized only by autotrophs, not by consumers. Consumers cannot survive without these AAs, which are assimilated directly from the diet and are commonly called

essential amino acids (EAAs). Consumer  $\delta^{13}\text{C}$ -EAA values do not differ significantly from the dietary EAAs of producers or prey (e.g., McMahon et al., 2011; reviewed in Whiteman et al., 2019; Yun et al., 2022), indicating (in)direct trophic relationships. Large differences in  $\delta^{13}\text{C}$ -EAA values have been used to describe the biomes of basal organism groups (e.g., primary producers and microorganisms) in diverse ecosystems, including terrestrial (e.g., Larsen et al., 2009; Pollierer et al., 2019), freshwater (e.g., Liew et al., 2019), sea-ice (e.g., Vane et al., 2023b), marine, and coupled environments (e.g. Larsen et al., 2013; McMahon et al., 2016; Takizawa et al., 2020; Eglite et al., 2023).

The  $\delta^{13}\text{C}$ -EAA values of producers, such as phytoplankton (Larsen et al., 2015; Stahl et al., 2023), vary according to environmental factors, such as the  $\delta^{13}\text{C}$  values of dissolved inorganic carbon, pH, salinity, temperature, light, and specific biosynthetic pathways during the synthesis and metabolism of EAAs. Adjusting the  $\delta^{13}\text{C}$ -EAA values to the mean of multiple  $\delta^{13}\text{C}$ -EAA values (expressed as mean-centered  $\delta^{13}\text{C}$ -EAA values in this study) or bulk  $\delta^{13}\text{C}$  values can help remove the baseline effects associated with local environments. Mean-centered  $\delta^{13}\text{C}$ -EAA values can vary among phylogenetically distinctive autotroph groups that presumably have their own specific biosynthetic pathways *de novo* (Larsen et al., 2009; Lynch et al., 2016; Besser et al., 2022). The unique signatures of mean-centered  $\delta^{13}\text{C}$ -EAA values can be used to discriminate among the basal organisms (Scott et al., 2006; Larsen et al., 2009, 2013; Besser et al., 2022). The mean-centered  $\delta^{13}\text{C}$ -EAA values have been frequently used to classify basal organisms such as plants, aquatic algae, fungi, and bacteria. However, fewer studies have systematically tested in marine primary producers whether mean-centered  $\delta^{13}\text{C}$ -EAA values remain consistent over broad temporal and spatial scales, such as yearly, seasonal, and environmental variations, in marine producers (Larsen et al., 2015 for microalgae; Elliott Smith et al., 2022 for macroalgae).

Previous studies have shown that mean-centered  $\delta^{13}\text{C}$ -EAA values can be used to effectively differentiate among macroalgal groups, including Phaeophyta (kelp), Rhodophyta and Chlorophyta/particulate organic matter (Larsen et al., 2013; Elliott Smith et al., 2021, 2022). Mean-centered  $\delta^{13}\text{C}$ -EAA values can also distinguish macroalgae from other macrophytes such as seagrass (Larsen et al., 2013). Elliott Smith et al. (2022) further expand upon this feature by demonstrating the utility of mean-centered  $\delta^{13}\text{C}$ -EAA values across varying geographic and temporal scales, using both historical and modern samples. However, whether mean-centered  $\delta^{13}\text{C}$ -EAA values reliably classify diverse macrophyte groups under ongoing environmental changes remains unclear, as these changes can affect the variability of  $\delta^{13}\text{C}$ -EAA values. The aim of this study was to deepen our understanding of the variation of  $\delta^{13}\text{C}$ -EAA values in macrophytes across different environmental conditions. We measured the variation of  $\delta^{13}\text{C}$ -EAA and mean-centered  $\delta^{13}\text{C}$ -EAA values in diverse macrophytes, ranging from members of Phaeophyta, Rhodophyta and Chlorophyta to seagrass, collected from the field at different sites and/or times, as well as in laboratory cultures (in particular, the macroalga *Ulva*), under different temperature gradients and nitrogen sources. We also assessed whether macroalgal  $\delta^{13}\text{C}$ -EAA values can indicate local

environmental characteristics and trophic links with co-occurring grazers. Finally, we examined if mean-centered  $\delta^{13}\text{C}$ -EAA values can be used to distinguish among macrophyte groups amid environmental changes.

## 2 Material and methods

### 2.1 Sample collection in fields

Macrophyte samples were collected from three sites in two regions (Jeju Island and Busan) in South Korea (Figure 1). In the rocky subtidal site of Munseom Island ( $33^{\circ} 13.583' \text{ N}$ ,  $126^{\circ} 33.950' \text{ E}$ ) south of Jeju Island, samples of a representative kelp, *Ecklonia cava*, were collected by scuba divers in four seasons (April, August, and November of 2014, and February of 2015). Munseom Island has been managed as a marine protected area and serves as a representative site for monitoring the effects of climate change at the ecosystem scale in Korea. By applying a hole-punch marking method to the blades of *Ecklonia* individuals (Yokohama et al., 1987; Bearham et al., 2013), newly grown blades were used for AA analysis. In Hamdeok, northern Jeju Island ( $33^{\circ} 32.897' \text{ N}$ ,  $126^{\circ} 39.336' \text{ E}$ ), samples of free-floating *Ulva* species were handpicked in December of 2020 and February and December of 2021. *Ulva ohnoi* was the prevalent species at this site, where a large semi-enclosed tide pool with eutrophication attributable to high nitrate levels is present year-round. *Ulva* was originally a subtropical genus, but it has recently been introduced to temperate regions (Kang et al., 2019). Finally, three brown algae (*Sargassum horneri*, *S. muticum*, and *S. thunbergii*), four red algae (*Polyopes affinis*, *Grateloupia*

*cornea*, *Gelidium amansii*, and *Chondria crassicaulis*), and one green alga (*Ulva australis*) were collected from the lower intertidal zone to the upper subtidal rocky shore in Busan ( $35^{\circ} 02.673' \text{ N}$ ,  $128^{\circ} 51.025' \text{ E}$ ) in April 2020. Along with macroalgal sampling, seagrasses (*Zostera marina* and *Z. japonicus*) were also obtained from the subtidal and intertidal zones of the soft-bottom habitat in December 2018. Co-occurring consumers in the intertidal macroalgal assemblage were also sampled, including meso-sized caprellid amphipods (*Caprella* sp.), which are grazers and detritus feeders. All macrophyte samples were cleaned by removing epiphytes and epibenthos following visual examination and rinsed with distilled water. The samples were then freeze-dried, ground to a fine powder, and stored at  $-20^{\circ}\text{C}$  until analysis.

### 2.2 *Ulva* culture: interactive temperature and additional N source treatment

We investigated the combined effects of temperature and added nitrogen (N) on the stable isotope ratios of the *Ulva* tissues. Before the experiment, the specimens were cleaned and pre-cultured for 5 days in filtered seawater at  $12^{\circ}\text{C}$  and exposed to  $100 \mu\text{mol photons m}^{-2} \text{ s}^{-1}$  under a photoperiod of 12 h light and 12 h dark. After acclimation, 1 g (fresh weight) of healthy samples was cultivated in 500-mL conical flasks. The samples were exposed to three different temperatures ( $12$ ,  $20$ , and  $27.5^{\circ}\text{C}$ ) and two different nutrient levels (control: ambient seawater only, and added N: a mix of  $100 \mu\text{M NO}_3^-$  and  $100 \mu\text{M NH}_4^+$ ) for 2 weeks. Three replicate test flasks were used for each treatment, for a total of 18 flasks. The culture

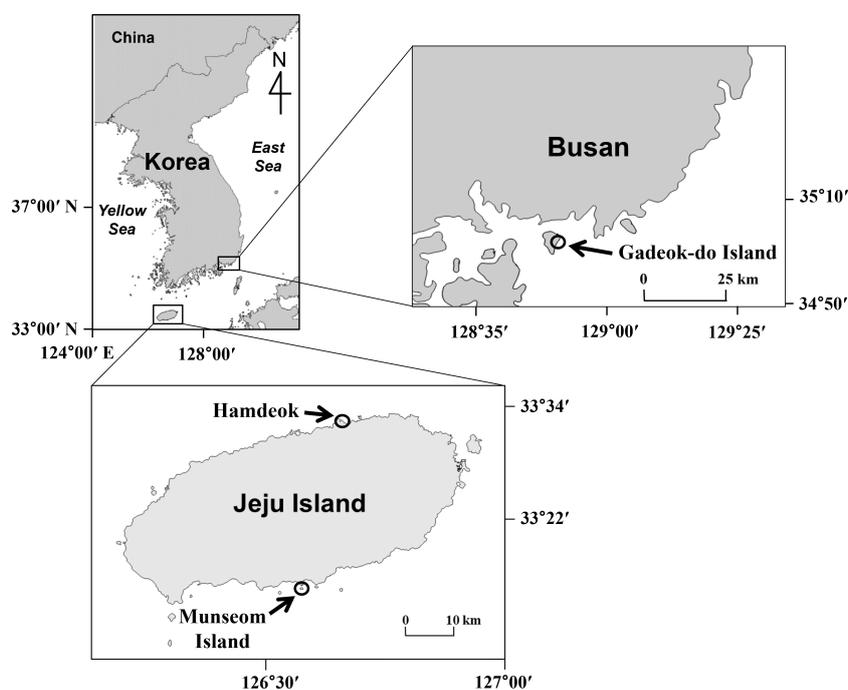


FIGURE 1  
Sample collection sites in Busan and Jeju Island from the Republic of Korea.

media were replaced daily during. All other conditions were the same as mentioned above for the pre-culture.

## 2.3 Sample preparation for analyzing $\delta^{13}\text{C}$ -EAA values

Reagent-grade standard AAs, including Val, Leu, Ile, Phe (Shoko Science Co., Ltd., Yokohama, Japan), Thr, Lys, alanine, glycine, serine, aspartic acid, proline, and glutamic acid (Sigma-Aldrich, St. Louis, MO, USA) were purchased and prepared at a concentration of 50 mM in 0.1 M HCl to create a standard AA mixture. Norleucine (Shoko Science, Japan) was also added as an internal standard. Reagent-grade acetyl chloride (Thermo Fisher Scientific, Lancashire, UK), acetic anhydride, and trimethylamine (Sigma-Aldrich, St. Louis, USA) were used in this study. Analytical-grade acetone, chloroform, hexane, and ethyl acetate were purchased from Merck KGaA (Darmstadt, Germany) and 12.1 M HCl (Junsei Chemical Co. Ltd., Tokyo, Japan).

To produce AAs suitable for gas chromatography (GC) analysis, we followed a protocol described by [Corr et al. \(2007\)](#) with slight modifications. In brief, approximately 10 mg of macrophyte samples were hydrolyzed with 1 mL of 6 N HCl at 110°C for 20 h to obtain an AA hydrolysate. The AA layer was separated from the lipophilic fractions by adding 2 mL of hexane-DCM (6:5, v/v). The AA hydrolysate layer was transferred, dried, and stored at -20°C. Next, the AA hydrolysate was methylated with 0.63 mL of acidified methanol solution (acetyl chloride: anhydrous methanol, 1:6 by volume) at 75°C for 1 h, and the reagents were dried under a N<sub>2</sub> flow. Subsequently, the AA methyl esters were mixed with 0.75 mL of the acetylation mixture (acetic anhydride: trimethylamine: acetone, 1:5:9 by volume) at 60°C for 10 min, and the reagents were evaporated. The AA derivatives were purified by adding ethyl acetate and a saturated NaCl solution, and the top layer was transferred to a new vial. Finally, the ethyl acetate layer was concentrated to 300  $\mu\text{L}$  under a gentle N<sub>2</sub> stream.

## 2.4 Gas chromatography–isotope mass spectrometry analysis

The  $\delta^{13}\text{C}$ -EAA values were measured by gas chromatography-combustion-isotope ratio mass spectrometry at the Hanyang University Isotope Ecology and Environmental Science Laboratory (Ansan, Korea). This analytical platform consists of a gas chromatograph (Hewlett Packard 7890 N series, Agilent Technologies, Santa Clara, CA) with a GC5 combustion interface (Elementar, Germany) connected to an Isoprime isotope ratio mass spectrometer (Elementar, Germany). The AA derivatives were injected in splitless mode at 250°C and separated on a VF-35 capillary column (Agilent Technologies, Santa Clara, CA USA; 30 m  $\times$  0.32 mm internal diameter, 1- $\mu\text{m}$  film thickness) at a constant flow rate of 1.2 mL/min following a set temperature program: 75°C for min), 135°C at 20°C min<sup>-1</sup>, 160°C at 5°C min<sup>-1</sup> for 3 min, and 300°C at 8°C min<sup>-1</sup> for 10 min. The separated AAs were completely oxidized to CO<sub>2</sub> gas and introduced into the

isotope ratio mass spectrometer. The samples were run in duplicate with the standard AA mixture.

The analytical precision of the standard AA mixture was < 0.5‰ of the averaged standard deviation (SD), ranging from 0.4‰ (for Phe) to 1.1‰ (for Ile). The  $\delta^{13}\text{C}$  values of each AA for every sample were corrected using a  $\delta^{13}\text{C}$ -certified AA standard to account for the non-analyte carbons from the derivative reagent incorporated into compounds of interest during derivatization ([Corr et al., 2007](#)).

We focused on analyzing the  $\delta^{13}\text{C}$ -EAA values for Val, Ile, Leu, Thr, Phe, and Lys ([Supplementary Figure 1](#)). If the  $\delta^{13}\text{C}$  data were not reliable (e.g., > 5‰ difference within treatment of *Ulva* culture, Lys), the data were not used for subsequent analyses. Mean-centered  $\delta^{13}\text{C}$ -EAA values (the  $\delta^{13}\text{C}$  differences between individual EAA and the mean of EAA variables) were also recorded.

## 2.5 Statistical analysis

The normality was tested in Q-Q plots, and the homogeneity of all data was checked using Levene's test. If the assumptions were met, significant differences in  $\delta^{13}\text{C}$ -EAA and mean-centered  $\delta^{13}\text{C}$ -EAA values for the *Ecklonia* and *Ulva* macroalgae collected at different sampling times were tested using one-way analysis of variance (ANOVA), and differences in the seagrass *Zostera* from the two habitats (intertidal and subtidal) were tested with a t-test (p-value < 0.05). When the assumptions were not met for ANOVA, Welch's ANOVA was performed as the equivalent of normal ANOVA. The effects of the temperature increase (three levels: 12, 20, and 27.5°C) and added N (two levels: added N and a control) on  $\delta^{13}\text{C}$ -EAA and mean-centered  $\delta^{13}\text{C}$ -EAA values were examined using two-way ANOVAs. If significant interaction effects were observed in the two-way ANOVAs, we performed separate one-way ANOVAs for the control and added N treatments as an alternative to *post hoc* tests. These were performed after applying a sequential Bonferroni adjustment to compensate for inflated significance levels due to the multiple comparisons made during analysis ([Lee and Lee, 2018](#)). Accordingly, a more conservative p-value of 0.05/k (i.e., k = 3, where k refers to the levels of the temperature gradient in this analysis, [Rice, 1989](#)) was chosen rather than 0.05. The significant differences between  $\delta^{13}\text{C}$ -EAA and mean-centered  $\delta^{13}\text{C}$ -EAA values among macroalgae and seagrasses with the meso-grazer *Caprella* were tested using one-way ANOVA. Principal component analysis (PCA) was also performed to assess the applicability of the  $\delta^{13}\text{C}$ -EAA values to characterization of local environments for macrophytes and co-occurring grazers. All statistical procedures were performed using JMP Pro v17.0 and Past4.03. Linear discriminant analysis (LDA) with  $\delta^{13}\text{C}$ -EAA and mean-centered  $\delta^{13}\text{C}$ -EAA values, respectively, were used to find a best separation among macrophytes groups (red, green and brown macroalgae and seagrass). The LDA model with the isotope data set of macrophytes groups was used to predict source groups for consumer *Caprella* individuals.

Using mean-centered  $\delta^{13}\text{C}$ -EAA values, a LDA classification model was used to calculate the probability of group membership for the samples classified based on macrophytes obtained from this

study and the published data (Larsen et al., 2009, 2013; Elliott Smith et al., 2021). Standard ellipse areas were plotted for the bivariate means of the groups in the LDA plot, with each ellipse enclosing approximately 50% of the data. To estimate the overlapping degree of pairing ellipses on the LDA transformed data (Vane et al., 2023a), areas of overlapping and pairing ellipses were calculated based on their posterior distribution using R statistical software version 4.3.1 (R Core Team, 2023) and the SIBER package (Jackson et al., 2011; Jackson, 2023). Given two distributions of an A group and a B group, we calculated the Bhattacharyya coefficients (BCs, Bhattacharyya, 1946) as follows:

$$BCs = \sqrt{\frac{Area_{overlap}}{Area_{groupA}} \times \frac{Area_{overlap}}{Area_{groupB}}}$$

If the BC was close to 1, the distribution of Group A and Group B were similar, while if the BC was close to 0, the distribution of two groups were dissimilar.

### 3 Results

#### 3.1 Environmental variation on $\delta^{13}C$ -EAA values

##### 3.1.1 Field-collected macrophytes

The average  $\delta^{13}C$ -EAA values in seagrass *Zostera* from the intertidal zone ranged from  $-7.9\text{‰}$  to  $-23.2\text{‰}$ , and in the subtidal zone, they ranged from  $-7.2\text{‰}$  to  $-21.0\text{‰}$  (Figure 2A, Table 1). Neither  $\delta^{13}C$ -EAA nor mean-centered  $\delta^{13}C$ -EAA values differed significantly between the two sites. This indicates that the site had little effect on  $\delta^{13}C$ -EAA and mean-centered  $\delta^{13}C$ -EAA values

(Figure 2A). For the perennial macroalga, the average  $\delta^{13}C$ -EAA value of *Ecklonia* collected in spring ranged from  $-4.1\text{‰}$  (Thr) to  $-32.3\text{‰}$  (Leu), and a similar isotopic range was also observed for other sampling times (Figure 2B, Table 1). At the level of individual EAAs in *Ecklonia*, the  $\delta^{13}C$  values of Leu and Ile in *Ecklonia* were, on average, 3.1‰ and 8.0‰ higher in summer than in winter (Figure 2B, Table 1,  $p < 0.01$ ), although there was little significant effect of seasonal variation on the  $\delta^{13}C$  values of Val, Thr, Phe and Lys. The mean-centered  $\delta^{13}C$ -EAA values of Leu, Ile, Thr, and Lys in *Ecklonia* did differ, by an average 1.9‰ (Leu) and 6.5‰ (Ile) among the seasons (Table 1). For the other macroalga, *Ulva*, an ephemeral genus, there were no significant effects of temporal variations (Figure 2C), although only Val was slightly low in February 2021 compared with other sampling times ( $p = 0.05$ ). Most mean-centered  $\delta^{13}C$ -EAA values in *Ulva* did not differ significantly among the seasons, and only Val was isotopically low in February 2021. This difference suggests that mean-centered  $\delta^{13}C$ -EAA values for *Ecklonia* and *Ulva* allowed for a slight reduction in the magnitude of variation at temporal scales.

##### 3.1.2 Lab-cultured *Ulva*

There were significant interaction effects of temperature gradients and added N on most AAs, particularly for Val, Ile, Thr, and Phe, and on mean-centered  $\delta^{13}C$ -EAA values of Leu in *Ulva* (Supplementary Table 1, Figure 3). In fact, most AAs in *Ulva* incubated in seawater (controls) did not differ significantly among the temperature gradients, but the  $\delta^{13}C$  values of Leu and Ile at 12°C were lower by approximately  $> 2.9\text{‰}$  than the one at 27.5°C (Figure 3A). The temperature-induced effect was stronger in *Ulva* under added N. That is, the EAAs of *Ulva* under added N had a low  $\delta^{13}C$  value at 12°C and a high  $\delta^{13}C$  value at 27.5°C ( $p_{corrected} < 0.017$ , Figure 3B), and the variability was

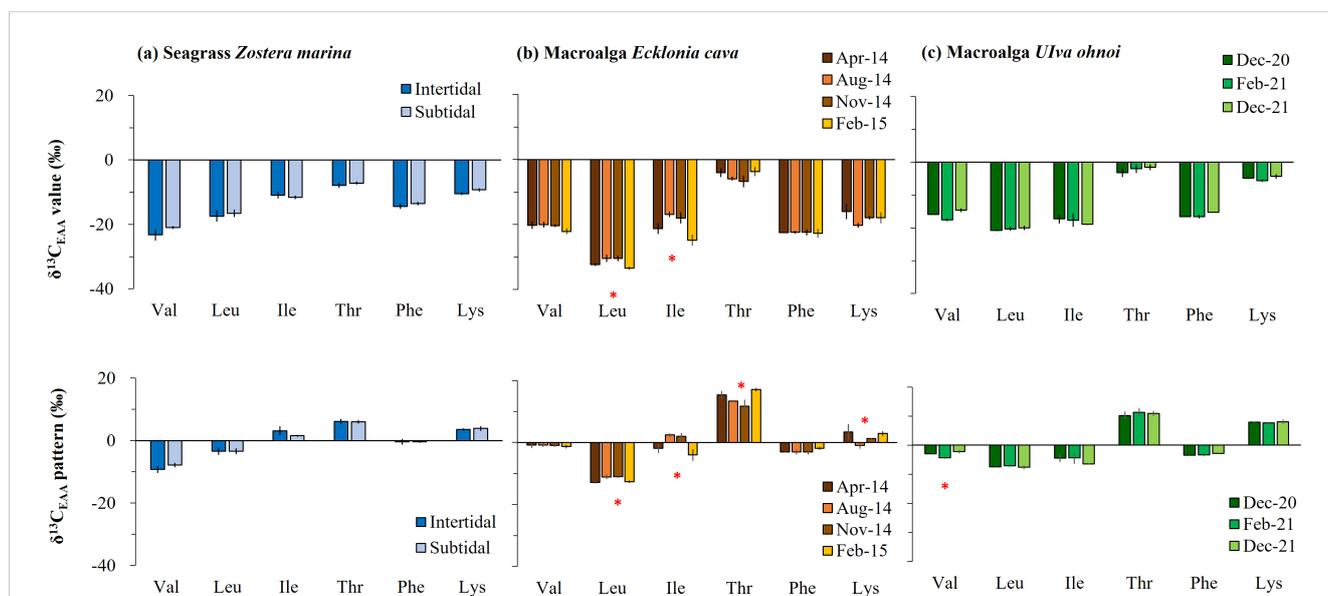
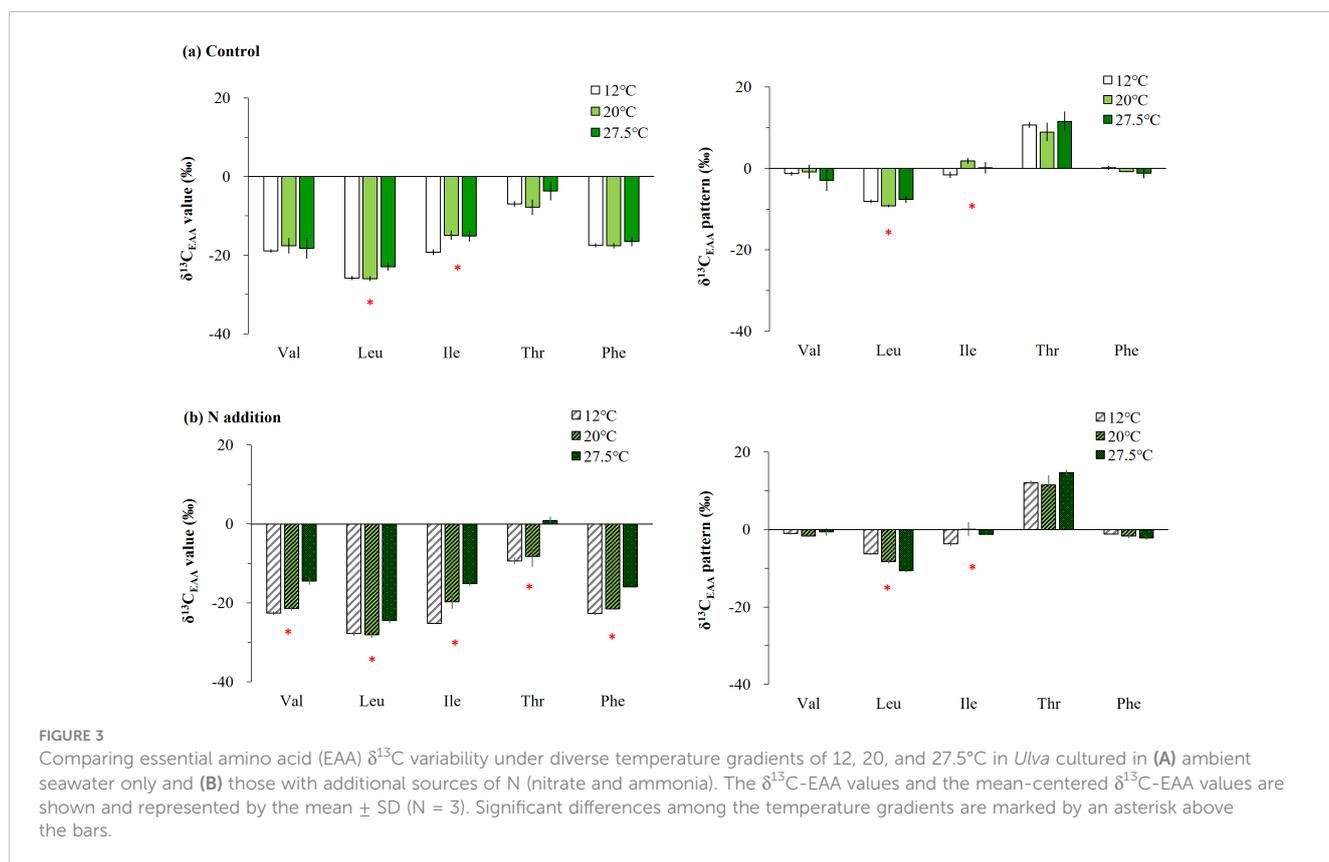


FIGURE 2 Temporal and spatial variation in essential amino acid (EAA) carbon stable isotope ( $\delta^{13}C$ ) values for macrophytes collected in the field: (A) brown macroalga *Ecklonia cava*, (B) green macroalga *Ulva ohnoi*, and (C) seagrass *Zostera marina*. The  $\delta^{13}C$ -EAA values and mean-centered  $\delta^{13}C$ -EAA values ( $\delta^{13}C$  difference between individual EAA and the average of overall EAAs) are shown and represented by the mean  $\pm$  SD (N = 3). Significant differences are marked by an asterisk above the bars.

**TABLE 1** Carbon stable isotope values of essential amino acids ( $\delta^{13}\text{C}$ -EAA values) such as valine (Val), leucine (Leu), isoleucine (Ile), threonine (Thr), phenylalanine (Phe), and lysine (Lys) from macrophytes collected in the field in Korea.

	Seagrass <i>Zostera marina</i>				Brown macroalga <i>Ecklonia cava</i>								Green macroalga <i>Ulva ohnoi</i>					
	Intertidal		Subtidal		Apr.2014		Aug.2014		Nov.2014		Feb.2015		Dec.2020		Feb.2021		Dec.2021	
	Mean	SD	Mean	SD	Mean	SD	Mean	SD	Mean	SD	Mean	SD	Mean	SD	Mean	SD	Mean	SD
<b><math>\delta^{13}\text{C}</math>-EAA value</b>																		
Val	-23.2	1.8	-21.0	0.5	-20.3	1.1	-20.1	0.9	-20.3	0.5	-22.1	0.9	-17.0	0.9	-21.5	0.5	-17.5	1.1
Leu	-17.4	1.7	-16.6	1.2	-32.3	0.5	-30.4	1.1	-30.5	0.8	-33.5	0.5	-26.0	0.6	-28.1	0.8	-20.3	0.6
Ile	-10.9	1.1	-11.6	0.6	-21.3	1.6	-16.9	0.8	-18.0	1.7	-24.8	1.7	-14.9	1.2	-19.7	1.8	-16.9	1.8
Thr	-7.9	0.8	-7.2	0.6	-4.1	1.4	-5.9	0.6	-6.8	1.8	-3.7	1.4	-7.8	1.9	-8.8	1.0	-1.9	0.7
Phe	-14.4	0.8	-13.5	0.6	-22.5	0.1	-22.3	0.4	-22.4	0.9	-22.7	1.4	-17.6	0.7	-21.5	0.2	-16.5	0.7
Lys	-10.5	0.5	-9.3	0.5	-16.0	2.4	-20.2	0.8	-17.9	0.5	-17.9	1.7	-4.9	0.7	-5.6	0.9	-4.3	2.1
<b>Mean-centered <math>\delta^{13}\text{C}</math>-EAA value</b>																		
Val	-9.2	1.1	-7.8	0.6	-0.9	0.9	-0.8	0.6	-0.9	0.5	-1.3	0.6	-1.8	0.2	-3.9	0.2	-4.6	0.3
Leu	-3.4	1.1	-3.4	0.9	-12.9	0.4	-11.1	0.7	-11.0	0.5	-12.7	0.4	-11.0	0.0	-10.5	0.2	-7.3	0.7
Ile	3.2	1.5	1.6	0.3	-1.9	1.5	2.5	0.6	2.0	1.0	-4.0	1.9	0.1	1.1	-2.2	1.3	-4.0	1.2
Thr	6.2	0.8	6.0	0.6	15.3	1.3	13.4	0.3	11.7	2.1	17.0	0.6	5.7	0.3	8.7	0.4	11.0	1.3
Phe	-0.4	0.9	-0.3	0.4	-3.1	0.2	-3.0	0.8	-3.0	0.9	-1.9	0.6	-2.7	0.4	-4.0	0.8	-3.6	0.4
Lys	3.6	0.3	3.9	0.7	3.4	2.5	-0.9	1.0	1.3	0.2	2.9	0.8	9.8	1.1	11.9	1.0	8.6	1.2

A mean-centered  $\delta^{13}\text{C}$ -EAA value is the individual  $\delta^{13}\text{C}$ -EAA value, normalized to the mean of overall  $\delta^{13}\text{C}$ -EAA values. Seagrass was collected at two sites, the subtidal and the intertidal zone at the same date, and macroalgae *Ecklonia* and *Ulva* were sampled from the same location (as shown in Figure 1) at different dates. The data are represented by the mean and SD (n = 3).



**FIGURE 3** Comparing essential amino acid (EAA)  $\delta^{13}\text{C}$  variability under diverse temperature gradients of 12, 20, and 27.5°C in *Ulva* cultured in (A) ambient seawater only and (B) those with additional sources of N (nitrate and ammonia). The  $\delta^{13}\text{C}$ -EAA values and the mean-centered  $\delta^{13}\text{C}$ -EAA values are shown and represented by the mean  $\pm$  SD (N = 3). Significant differences among the temperature gradients are marked by an asterisk above the bars.

approximately 7.7‰ throughout the overall AAs. However, no temperature-induced effect was observed in mean-centered  $\delta^{13}\text{C}$ -EAA values; Val, Thr, and Phe were not significantly affected by temperature increases, although Leu and Ile was higher at 12°C compared with 27.5°C (Figure 3B).

### 3.2 Application of $\delta^{13}\text{C}$ -EAA values in food web analysis

The  $\delta^{13}\text{C}$ -EAA values of seven common macrophytes collected in Busan are shown in Supplementary Table 2. The  $\delta^{13}\text{C}$ -EAA values ranged from -30.8‰ to -1.2‰ for red macroalgae, from -27.3‰ to -3.2‰ for brown macroalgae, and from -23.8‰ to -4.7‰ for green one, which were overlapped from -22.4‰ to 2.5‰ for seagrass (Figure 4A). The  $\delta^{13}\text{C}$  values for Val, Leu, Ile, Thr, Phe and Lys were low in red macroalgae (e.g., *Gelidium*), but high in green macroalgae and seagrass. However, such differences among macrophytes were less detected in mean-centered  $\delta^{13}\text{C}$ -EAA values (Figure 4B).

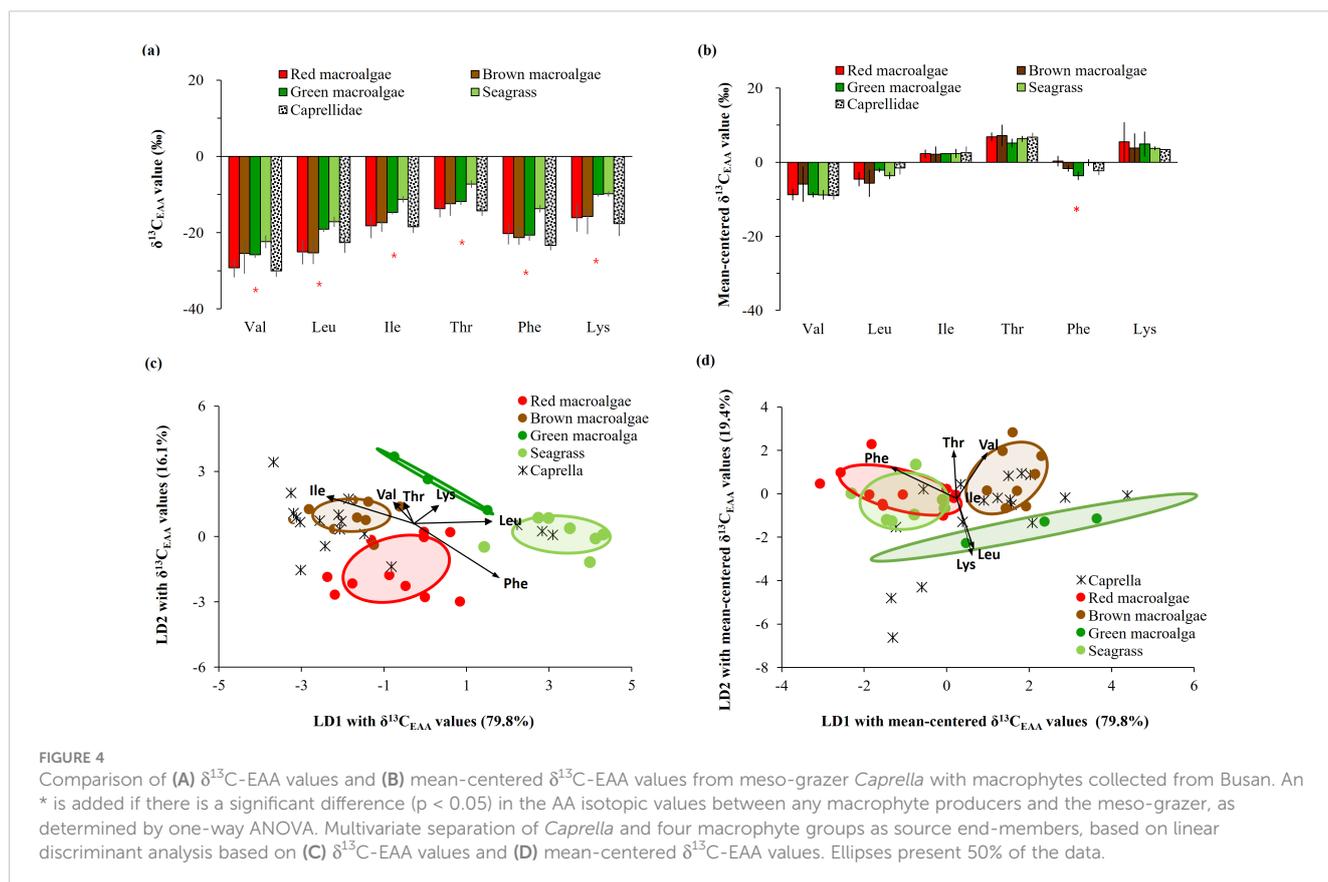
The  $\delta^{13}\text{C}$ -EAA values of the consumer *Caprella* differed significantly from those of the seagrass groups (with an average difference of > 5.45‰, Figure 4A), and they were relatively similar to those of the macroalgal groups. The difference in  $\delta^{13}\text{C}$ -EAA values between *Caprella* and seagrass was observed for Phe only in the context of mean-centered  $\delta^{13}\text{C}$ -EAA values (Figure 4B).

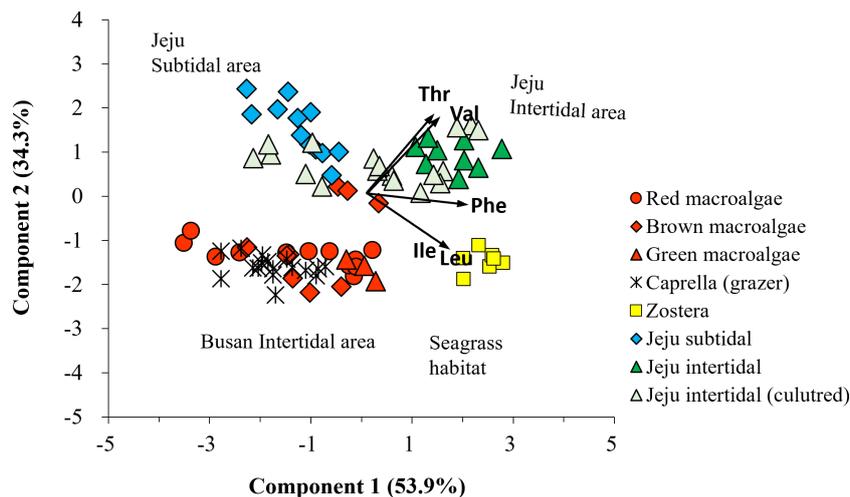
A LDA plot with  $\delta^{13}\text{C}$ -EAA values of four macrophyte groups from Busan showed that red, brown, and green macroalgal groups

and seagrass group were classified with 90.0% probability within their own groups (Wilks'  $\lambda = 0.05$ ,  $F = 6.27$ ,  $p < 0.001$ , Figure 4C). This supports that  $\delta^{13}\text{C}$ -EAA values can be used to distinguish among macrophytes. Moreover, the LDA model among four macrophyte groups predicted that overall *Caprella* individuals were closely located to macroalgal groups (mostly brown macroalgae), but not to seagrass groups (Figure 4C, Supplementary Table 3). A PCA with the  $\delta^{13}\text{C}$ -EAA values also showed that *Caprella* was clustered with the co-sampled macroalgae from a local environment (Busan) and separated from the other environments, such as the seagrass site (Figure 5). This distinctiveness implies that the  $\delta^{13}\text{C}$ -EAA values in a consumer can reveal direct trophic links with a co-occurring macrophyte in a local environment.

### 3.3 Assessing the consistency of mean-centered $\delta^{13}\text{C}$ -EAA values across field and comparative studies

When LDA analysis was performed with mean-centered  $\delta^{13}\text{C}$ -EAA values for macroalgal groups collected from Busan, red, brown and green macroalgal groups were classified with 95.6% probability within their own groups (Wilks'  $\lambda = 0.18$ ,  $F = 3.35$ ,  $p = 0.004$ ). Upon adding mean-centered  $\delta^{13}\text{C}$ -EAA values for the seagrass group, LDA analysis showed that the seagrass group was classified to its own group with 71.4% posterior probability, but 28.6% of the seagrass group overlapped with red macroalgal groups





**FIGURE 5**  
Principal component analysis of  $\delta^{13}\text{C}$ -EAA values (including Val, Leu, Ile, Thr, and Phe) in macrophytes (circle: red algae; diamond: brown algae; triangle: green algae; square: seagrass) collected at multiple sites (red: Busan intertidal area; yellow: seagrass area; blue: Jeju subtidal area; green: Jeju intertidal area; pale green: *Ulva* culture). The  $\delta^{13}\text{C}$ -EAA values from the meso-grazer group *Caprella* overlapped with those of the macroalgal groups, which were collected on the Busan intertidal shore.

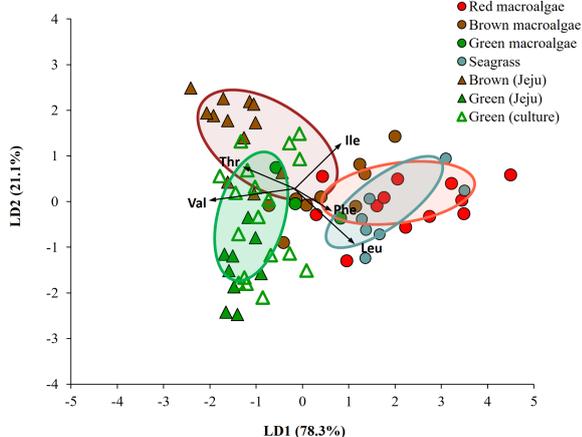
(Figure 4D). The green macroalgal group did not overlap with either the red macroalgal or seagrass group. The LDA model based on mean-centered  $\delta^{13}\text{C}$ -EAA values of the four macrophyte groups showed that overall *Caprella* individuals were widely distributed from macroalgal groups (green and brown macroalgae) to seagrass group (Figure 4D), with lower prediction probabilities than the LDA model based on  $\delta^{13}\text{C}$ -EAA values (Supplementary Table 3). The separation among the four macrophytes in Busan remained even after including macroalgal samples collected from Jeju and lab-cultured *Ulva* in the analysis (Figure 6).

On applying diverse taxonomic groups, our LDA model correctly classified 76 of 100 samples (76%) within their own groups of bacteria, microalgae, macroalgae, and seagrass, using

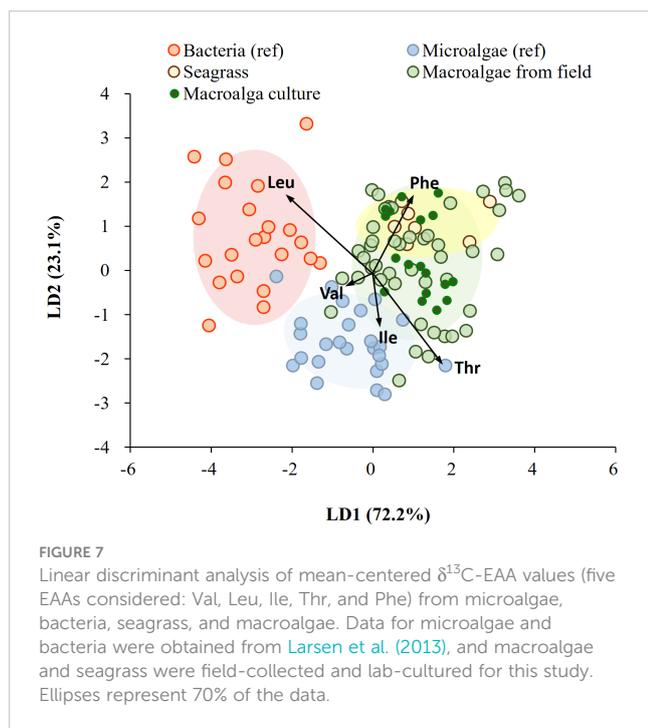
previously published dataset (Larsen et al., 2009, 2013; Elliott Smith et al., 2021). LDA confidence ellipses for bacteria, microalgae, macroalgae, and seagrass did not fully overlap, and the bacteria and seagrass groups in particular were distinct from each other (Supplementary Figure 2A). Both macroalgae and seagrass showed comparably low dissimilarity (i.e., a low BC value) to bacteria (Supplementary Table 4). This consistency was observed with a predictability of 75% using seagrass and macroalgal groups from the field as end members (Supplementary Figure 2B). The model successfully classified all bacteria, 96% of microalgae, all seagrasses, and 47% of macroalgae. A low similarity (a low BC value) was seen between macroalgae and bacteria, but high similarity (a high BC value) with seagrass (Supplementary Table 4). With the addition of lab-cultured macroalgal samples to the macroalgal group, the model successfully classified all bacteria, the majority of macroalgae (64%), most microalgae (96%), and all seagrass (Figure 7). This suggests that phylogeny grouping plays a more significant role in separation than the physiological responses of macroalgae to environmental changes.

## 4 Discussion

Our findings show that mean-centered  $\delta^{13}\text{C}$ -EAA values in macrophytes remain consistent under environmental changes. Similar to microalgal cultures over diverse abiotic conditions (Larsen et al., 2015; Stahl et al., 2023), our study re-confirms that field sampling over temporal variations and cultured setups with added N and temperature gradients can influence the  $\delta^{13}\text{C}$ -EAA values of macrophytes. We found that interactions between higher temperatures and added N increased  $\delta^{13}\text{C}$ -EAA values. Carbon isotope fractionation in EAAs in response to temperature and nutrient availability can be mediated by increasing biomolecule quantities, such as those for AAs and sugars (Gao et al., 2018; He



**FIGURE 6**  
Linear discriminant analysis with mean-centered  $\delta^{13}\text{C}$ -EAA values (5 EAAs: Val, Leu, Ile, Thr, Phe) of macrophytes collected in the field (Busan and Jeju) and lab-cultured sample. Ellipses present 50% of the data.



et al., 2018; Chen et al., 2023). However, distinct mean-centered  $\delta^{13}\text{C}$ -EAA values among different macroalgal groups were observed across spatio-temporal scales, which is consistent with previous studies (Elliott Smith et al., 2022). Both  $\delta^{13}\text{C}$ -EAA and mean-centered  $\delta^{13}\text{C}$ -EAA values in macrophytes can therefore be used to assess ecological changes, including eutrophication and climate change, in a local environment.

#### 4.1 Effect of environmental variations on macrophytes

We examined the  $\delta^{13}\text{C}$ -EAA values in *Zostera* seagrass from two habitats (subtidal and intertidal areas) collected simultaneously. *Zostera* is widely distributed in both intertidal and subtidal zones due to its physiological flexibility to cope with diverse abiotic conditions, such as high irradiance and desiccation-induced stress in intertidal zones relative to lower irradiance and submergence in the subtidal zone (Park et al., 2016). We expected to find distinct  $\delta^{13}\text{C}$ -EAA values in *Zostera* at spatial scales. However, there was no significant difference in individual  $\delta^{13}\text{C}$ -EAA values between intertidal and the subtidal specimens (Figure 2), although the overall mean of the  $\delta^{13}\text{C}$ -EAA values in the intertidal algae ( $-14.1\text{‰}$ ) was slightly lower than that of the subtidal algae ( $-13.2\text{‰}$ ). Marine macrophytes are known to utilize  $\text{HCO}_3^-$  (which has a relatively high  $\delta^{13}\text{C}$  value) as well as  $\text{CO}_2$  (which has a relatively low  $\delta^{13}\text{C}$  value) for photosynthesis (Fry and Sherr, 1989; Raven et al., 2002a). Bulk  $\delta^{13}\text{C}$  values ranging from  $-10\text{‰}$  to  $-30\text{‰}$  indicate that macrophytes use both  $\text{CO}_2$  and  $\text{HCO}_3^-$  with variable gradients as inorganic carbon sources (Raven et al., 2002a, 2002). Within this isotopic range,  $\text{HCO}_3^-$  users tend to be higher, while  $\text{CO}_2$  users tend to be lower due to the active use of carbon-

concentrating mechanisms during photosynthesis (Raven et al., 2002a, 2002). The slightly low carbon isotope value in intertidal *Zostera* relative to subtidal algae indicates that the major carbon sources for photosynthesis involve a higher proportion of atmospheric and/or dissolved  $\text{CO}_2$  compared with  $\text{HCO}_3^-$ . Consistent with our isotopic results, the  $\delta^{13}\text{C}$  value of bulk leaf tissue is considerably lower in intertidal algae compared with subtidal counterparts, particularly those collected in fall and winter in Korea (Park et al., 2016). The negligible difference in  $\delta^{13}\text{C}$ -EAA values between the two sites in our results indicates that seagrasses may exhibit a similar physiological response during the winter, possibly because of the less-dynamic conditions relative to other seasons and considering abiotic factors such as carbon sources, temperature, irradiance, and desiccation in intertidal and subtidal areas.

The perennial brown macroalga *Ecklonia* exhibited temporally variable  $\delta^{13}\text{C}$ -EAA values at diverse temporal scales (across seasons, as shown in Table 1 and Figure 2). For *Ecklonia*, the lowest  $\delta^{13}\text{C}$ -EAA values (Leu and Ile) were detected in the winter season (February 2015). Coinciding with the time period of the *Ecklonia* sampling for isotope measurement, both the blade length and biomass of the mature plant significantly increased in the field (Munseom Island) between winter and spring (Kim et al., 2016). Furthermore, active growth of *Ecklonia* in the lab was observed, particularly at low temperatures simulating ambient conditions during winter, in addition to nitrogen sources (Choi et al., 2020). Several studies consistently reported a decrease in the  $^{13}\text{C}$  of bulk macroalgal tissues during winter, based on the brown macroalgae *Macrocystis* (Drobnitch et al., 2018) and *Laminaria* (Shim et al., 2017). This phenomenon occurs during the coldest winter months in seawater, an active growth period, as indicated by the increase in both length and weight. This temperature-dependent response was also observed in opportunistic species of *Ulva*. In particular, field-collected *Ulva* exhibited a significant decrease in  $\delta^{13}\text{C}$ -Val values in February 2021 (the coldest month for seawater around Jeju Island) compared with the other sampling months (Figure 2). The lower  $\delta^{13}\text{C}$ -EAA values in macroalgae may therefore be a physiological response to colder temperatures, inducing active growth in the field.

Similar to the *Ulva* specimens collected from the field (Figure 2C), *Ulva* cultured with added nutrients ( $100\ \mu\text{M}\ \text{NO}_3^-$  and  $100\ \mu\text{M}\ \text{NH}_4^+$ ) exhibited isotopic changes influenced by temperature gradients. Specifically, all  $\delta^{13}\text{C}$ -EAA values changed gradually across the temperature gradients, with lower values observed at  $12^\circ\text{C}$  and higher values at  $27.5^\circ\text{C}$  (Figure 3B). To a lesser extent, Leu and Ile  $\delta^{13}\text{C}$  values from cultured *Ulva* in ambient seawater were also influenced by temperature, showing lower values at  $12^\circ\text{C}$  compared with  $20^\circ\text{C}$  or  $27.5^\circ\text{C}$  (Figure 3A). Previous studies on members of the *Ulva* genus report that the interactive effects of high N nutrients (nitrate and ammonium) and temperature differences increase the amount of AAs (Gao et al., 2018; He et al., 2018; Chen et al., 2023). In terms of AA metabolism, *U. ohnoi* under high-temperature conditions ( $35^\circ\text{C}$ ) has a much higher quantity of diversity of AAs (alanine, glycine, serine, glutamic acid, Val, Leu, Ile, Phe, and Tyr), while *Ulva* under low-temperature conditions ( $15^\circ\text{C}$ ) has increased quantities of a few AAs (Leu, Ile, Tyr, and proline) (He et al., 2018). Moreover, Gao et al. (2018)

reported that the protein content and AA quantities in *U. rigida* increased after 12 days of culturing with added N (e.g., 6  $\mu\text{M}$  to 150  $\mu\text{M}$  nitrate) and temperature conditions (14°C and 18°C). Active EAA accumulation in response to the combination of added N and temperature would therefore be expected in our *Ulva* sample.

A recently introduced species from subtropical regions, *U. ohnoi*, demonstrates strong adaptability to elevated temperatures and inorganic nitrogen sources. It can grow continuously even in warm seawater in temperate regions under diverse N sources (Kang et al., 2021). Our *Ulva* samples, when subjected to extremely high nitrogen supplies and a high temperature of 27.5°C, showed no dramatic decrease or degradation in the thalli. Instead, steady growth was observed over a two-week period (personal observation by SR Park). Previous studies have reported that an increase in temperature and nutrient additions may induce the accumulation AAs in *Ulva* thalli (Gao et al., 2018; He et al., 2018; Chen et al., 2023), as well as fructose, galactose, and mannose (involved in galactose metabolism), and fructose, sucrose, maltose, and glucose (involved in starch/sucrose metabolism) (He et al., 2018). Given the relationship between products and precursors, the  $\delta^{13}\text{C}$  values of products are expected to be lower than those of the precursors. This is because lighter isotopes such as  $^{12}\text{C}$  are used in larger quantities during biochemical processes, leaving behind a higher proportion of heavier isotopes such as  $^{13}\text{C}$ , in a process known as isotopic discrimination. The principle of isotopic discrimination suggests a general decrease in  $\delta^{13}\text{C}$ -EAA values, particularly if a single precursor is incorporated to produce a large amount of biomolecules or products (AAs). However, a broad spectrum of isotope values in diverse precursors would affect the  $\delta^{13}\text{C}$ -EAA values in the resulting products. The  $\delta^{13}\text{C}$ -EAA values in *Ulva* were unexpectedly high in our study (Figure 3B). This supports the possibility that the production of AAs and the carbon skeletons supplying them, under increased temperatures and added N, may be derived from different intermediates of the carbon backbones and the interconnection of diverse biosynthetic routes. The isotopic fractionation of  $\delta^{13}\text{C}$ -EAA values in *Ulva* may vary depending on environmental conditions, but further study is needed to determine whether a macroalgal AA-based indicator can be effective over a wide range of N concentrations, including the field gradient (Jones et al., 1996). However, our findings suggest that  $\delta^{13}\text{C}$ -EAA values can serve as a critical indicator for adaptations of macroalgae to changing environmental conditions in coastal oceans.

## 4.2 Ecological insights of $\delta^{13}\text{C}$ -EAA and mean-centered $\delta^{13}\text{C}$ -EAA values

In a PCA plot of  $\delta^{13}\text{C}$ -EAA values (Figure 5), the distinct effect of the sampling location is clear, with most intertidal macroalgae from Busan separated from seagrass (Busan), *Ecklonia* (Jeju subtidal area), and *Ulva* (Jeju intertidal area). A brown macroalga from Busan (*Sargassum muticum* only) was located close to other macroalgal species from Jeju Island. *Ulva* specimens (sampled in Jeju and grown in lab conditions for two weeks) exhibit a wide distribution relative to *Ulva* collected from the field (sampled in

Busan) in the PCA plot. Focusing on the Busan area, LDA plot with  $\delta^{13}\text{C}$ -EAA values also showed that macroalgal groups (red, green and brown macroalgae, respectively) were differentiated from seagrass group (Figure 4C). These results suggest that  $\delta^{13}\text{C}$ -EAA values of macrophytes can serve as indicators of basal organisms, local growth conditions, which vary across time and space at different geographic scales (Vokhshoori et al., 2014; Larsen et al., 2015; Elliott Smith et al., 2022; Stahl et al., 2023).

Specimens of the consumer *Caprella* were overlapped with co-sampled intertidal macroalgal samples in the Busan area (Figure 4). The LDA model with  $\delta^{13}\text{C}$ -EAA values of four macrophyte groups predicted overall *Caprella* individuals as macroalgal groups, mostly brown macroalgae (Figure 4C, Supplementary Table 3). Although three *Caprella* samples appeared to be close to the seagrass group (Figure 4C), due to LD3 component in LDA analysis (Supplementary Figure 3), they were actually predicted to belong to the green macroalgal group (Supplementary Table 3). Comparably, the LDA model with mean-centered  $\delta^{13}\text{C}$ -EAA values also showed that most *Caprella* samples were likely predicted as macroalgal groups rather than seagrass group (Figure 4D). Overall results indicate that *Caprella* samples seem to have assimilated EAAs from mainly brown macroalgae, but likely also other macroalgae or basal organism that they have not been tested. It is consistent with the feeding behavior of *Caprella*, which is both a grazer and a detritus feeder (Kang et al., 2008) that is unlikely to feed on bacteria or assimilate bacteria-produced EAAs.

At the level of individual EAAs, the  $\delta^{13}\text{C}$  values of Val, Leu, Ile, Thr, and Phe in the consumer *Caprella* were isotopically similar to one of macroalgal groups (red, green and brown macroalgal groups), but were significantly different from  $\delta^{13}\text{C}$ -EAA values in seagrass (Figure 4A).  $\delta^{13}\text{C}$ -EAA values, originating from trophic bases, are generally passed on through trophic transfer to consumers without significant changes in isotopic values (reviewed in Whiteman et al., 2019; Yun et al., 2022). As macrophytes groups exhibit distinguishable  $\delta^{13}\text{C}$ -EAA values (e.g., Figure 4), the small consumers co-occurring with seagrass beds should show isotopically different values from consumers co-occurring with macroalgal beds. When considering the “isotopic baseline” with  $\delta^{13}\text{C}$ -EAA values of the consumer *Caprella*, a difference in baseline  $\delta^{13}\text{C}$ -EAA values is expected, based on the assumption that consumer  $\delta^{13}\text{C}$ -EAA values reflect those of their primary food source. Although several studies have reported the potential of the  $\delta^{13}\text{C}$ -EAA values of consumers to serve as “isotopic baselines” adapted for specific geographic ecosystems and variations (e.g., Vokhshoori et al., 2014; McMahon et al., 2016; Vane et al., 2023b), the  $\delta^{13}\text{C}$ -EAA values of a mixed basal resource user (e.g., *Caprella*) might not be utilized as “isotopic baselines” to indicate specific local basal organisms in coastal areas. If one wants to trace the contribution of EAAs synthesized by specific basal organisms to a marine benthic consumer, it is essential to measure each basal organism directly, as is done in this study by analyzing individual macrophytes.

To minimize the influence of environmental characteristics on the physiological traits specific to macrophytes, we used mean-centered  $\delta^{13}\text{C}$ -EAA values (Larsen et al., 2013, 2015). Our hypothesis is consistent with prior research that found that mean-

centered  $\delta^{13}\text{C}$ -EAA values remain robust across different times and lab-cultured conditions, unlike the variable  $\delta^{13}\text{C}$ -EAA values. Indeed, both the temporal variation (Figure 2) and lab-cultured conditions (Figure 3) had a less significant impact on mean-centered  $\delta^{13}\text{C}$ -EAA values for macrophytes. The variability range for mean-centered  $\delta^{13}\text{C}$ -EAA values of cultured *Ulva* (approximately 1.0‰ to 4.4‰) was narrower than the  $\delta^{13}\text{C}$ -EAA values of 3.6‰ to 10.3‰. Similarly, field-collected *Ulva* exhibited a limited variability range of 1.2‰ to 5.3‰ for mean-centered  $\delta^{13}\text{C}$ -EAA values in contrast to 4.5‰ to 7.8‰ for  $\delta^{13}\text{C}$ -EAA values (Figure 2C). Our results support the notion that mean-centered  $\delta^{13}\text{C}$ -EAA values in hard- and soft-bottom portions of subtidal and intertidal zones remain consistent. Previous studies also report consistent mean-centered  $\delta^{13}\text{C}$ -EAA values in both laboratory experiments and collections from natural environments (Larsen et al., 2015; Elliott Smith et al., 2022). This approach can therefore be used to reliably characterize large taxonomic groups.

Using mean-centered  $\delta^{13}\text{C}$ -EAA values for macroalgae in Busan, an LDA plot (Figure 4D) shows distinct separation among brown (Phaeophyta), red (Rhodophyta), and/or green (Chlorophyta) algae, which is consistent with findings from previous studies (Larsen et al., 2013; Elliott Smith et al., 2021, 2022). This separation may be related to significant phylogenetic distances among macroalgal groups (e.g., Kloareg et al., 2021) and emphasizes the reliability of mean-centered  $\delta^{13}\text{C}$ -EAA values in distinguishing among macrophyte groups. This reliability is primarily influenced by taxonomic, morphological, and biochemical differences among macroalgal groups, while environmental variations have less of an impact. However, upon inclusion of seagrass group, a considerable overlap was observed between seagrass and red macroalgae, and this trend remained even after lab-cultured *Ulva* samples (green macroalga) were included in the LDA analysis (Figure 6). Although phylogenetic distances are relatively long between seagrass and red macroalgae (Kloareg et al., 2021), there was an overlap in the LDA plot. This overlap is likely due to the large variability among the macrophytes and the extreme variation in site-specific environmental conditions reported in this study, and therefore could add variances to the macroalgal groups in our LDA analysis. Furthermore, as training data from larger phylogenetic groups such as bacteria and microalgae were included, macroalgae overlapped with seagrass (Figure 7). However, the LDA results based on mean-centered  $\delta^{13}\text{C}$ -EAA values (Figure 7 and Supplementary Figure 2) were robust, correctly classifying seagrass, bacteria, and microalgae (> 88%). Including more EAAs in an LDA analysis may improve its ability to distinguish macrophytes for food web studies. These results indicate that mean-centered  $\delta^{13}\text{C}$ -EAA values of macrophytes can be used effectively to characterize benthic food webs, particularly in environments where macroalgae and seagrass do not abundantly co-occur, such as rocky shores (macroalgae-dominant environments) and sandy/muddy bottoms (e.g., seagrass meadows).

## 5 Conclusions

We investigated the variation of  $\delta^{13}\text{C}$ -EAA values in macrophytes, ranging from seagrass to red, brown and green macroalgae, across

diverse environmental conditions. We confirmed that diverse macrophytes can be classified by their mean-centered  $\delta^{13}\text{C}$ -EAA values, although the distinction between red macroalgae and seagrass was not clear. However, we were able to use  $\delta^{13}\text{C}$ -EAA values to differentiate among seagrass and macroalgal groups, particularly those from the Busan region. This indicates that  $\delta^{13}\text{C}$ -EAA values can serve as “isotopic baselines” to characterize local environments. Variation in  $\delta^{13}\text{C}$ -EAA and mean-centered  $\delta^{13}\text{C}$ -EAA values can therefore provide diverse insights into the characteristics of local trophic bases at sites undergoing environmental changes. To monitor the biochemical and ecological impacts of environmental problems, future studies should explore the effects of acidification,  $\text{CO}_2$  levels, and eutrophication on the stable isotope values of EAAs in a key macrophyte species and their associated consumers across geographic scales.

## Data availability statement

The data presented in the study are deposited in Figshare, available here: <https://doi.org/10.6084/m9.figshare.26519647.v3>.

## Ethics statement

The manuscript presents research on animals that do not require ethical approval for their study.

## Author contributions

HY: Conceptualization, Data curation, Formal analysis, Funding acquisition, Investigation, Methodology, Project administration, Resources, Supervision, Validation, Visualization, Writing – original draft, Writing – review & editing. SK: Formal analysis, Methodology, Resources, Writing – review & editing. HC: Formal analysis, Methodology, Writing – review & editing. JK: Formal analysis, Methodology, Writing – review & editing. SP: Methodology, Resources, Writing – review & editing. KS: Funding acquisition, Writing – review & editing.

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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.

The reviewer TL declared a past co-authorship with the authors.

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## Supplementary material

The Supplementary Material for this article can be found online at: <https://www.frontiersin.org/articles/10.3389/fmars.2024.1368801/full#supplementary-material>

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