- Simultaneous Onboard Analysis of Seawater
- 2 Dissolved Inorganic Carbon (DIC) Concentration
- and Stable Isotope Ratio ( $\delta^{13}$ C-DIC)
- 4 Zhentao Sun<sup>1,2</sup>, Xinyu Li<sup>1,3</sup>, Zhangxian Ouyang<sup>1</sup>, Charles Featherstone<sup>4</sup>, Eliot A. Atekwana<sup>5</sup>,
- 5 Najid Hussain<sup>1</sup>, Yiwen Pan<sup>2</sup>, and Wei-Jun Cai<sup>1,\*</sup>
- 6 <sup>1</sup> School of Marine Science and Policy, University of Delaware, Newark, Delaware 19716, USA
- <sup>2</sup> Ocean College, Zhejiang University, Zhoushan, Zhejiang 316021, People's Republic of China
- 8 <sup>3</sup> Cooperative Institute for Climate Ocean and Ecosystem Studies (CICOES), University of
- 9 Washington, Seattle, Washington 98105, USA
- 10 <sup>4</sup> Atlantic Oceanographic and Meteorological Laboratory, National Oceanic and Atmospheric
- 11 Administration, 4301 Rickenbacker Causeway, Miami, Florida 33149, USA
- 12 <sup>5</sup> Department Earth and Planetary Sciences, University of California Davis, Davis, California
- 13 95616, USA
- \* Corresponding author, e-mail address: wcai@udel.edu

#### Abstract

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Dissolved inorganic carbon (DIC) and stable carbon isotope ( $\delta^{13}$ C-DIC) are valuable parameters for studying the aquatic carbon cycle and quantifying ocean anthropogenic carbon accumulation rates. However, the potential of this coupled pair is underexploited as only 15 % or less of cruise samples have been analyzed for  $\delta^{13}$ C-DIC because the traditional isotope analysis is laborintensive and restricted to onshore laboratories. Here, we improve the analytical precision and reported the protocol of an automated, efficient, and high-precision method for ship-based DIC and  $\delta^{13}$ C-DIC analysis based on Cavity Ring-Down Spectroscopy (CRDS). We also introduced a set of stable in-house standards to ensure accurate and consistent DIC and  $\delta^{13}$ C-DIC measurements, especially on prolonged cruises. With this method, we analyzed over 1600 discrete seawater samples over a 40-day cruise along the North American eastern ocean margin in summer 2022, representing the first effort to collect a large dataset of  $\delta^{13}$ C-DIC onboard of any oceanographic expedition. We evaluated the method's uncertainty, which was 1.2  $\mu$ mol kg<sup>-1</sup> for the DIC concentration and 0.03 % for the  $\delta^{13}$ C-DIC value (1 $\sigma$ ). An interlaboratory comparison of onboard DIC concentration analysis revealed an average offset of  $2.0 \pm 3.8 \mu mol$ kg<sup>-1</sup> between CRDS and the coulometry-based results. The cross-validation of  $\delta^{13}$ C-DIC in the deep-ocean data exhibited a mean difference of only  $-0.03 \pm 0.07$  %, emphasizing the consistency with historical data. Potential applications in aquatic biogeochemistry are discussed.

### Keywords

- 34 dissolved inorganic carbon; stable carbon isotope; cavity ring-down spectroscopy; onboard
- 35 measurement; discrete sample; US Atlantic Ocean margin

## Introduction

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37	Since the Industrial Revolution, oceans have absorbed $\sim 25 \%$ of anthropogenic CO <sub>2</sub>
38	(Friedlingstein et al. 2023; Le Quéré et al. 2009), increasing seawater dissolved inorganic carbon
39	(DIC) concentration and lowering pH, altering biogeochemistry and endangering carbonate-
40	bearing organisms. High-resolution DIC concentration measurements are key for marine studies
41	(Carter et al. 2019), yet tracking oceanic anthropogenic carbon changes solely through DIC
42	increase is limited due to minor changes against high background levels and large spatiotemporal
43	variability (Doney et al. 2009). The $^{13}$ C/ $^{12}$ C ratio of oceanic DIC ( $\delta^{13}$ C-DIC), influenced by the
44	<sup>13</sup> C depleted CO <sub>2</sub> from fossil fuel burning (the Suess effect), can serve as an effective marker for
45	estimating oceanic anthropogenic CO <sub>2</sub> changes (Keeling 1979; Lynch-Stieglitz et al. 1995). In
46	particular, Quay and co-workers proposed that $\delta^{13}C$ could be a more sensitive tracer than DIC for
47	quantifying anthropogenic CO <sub>2</sub> accumulation rates in the ocean due to a stronger anthropogenic
48	perturbation than natural spatiotemporal variability (Quay et al., 2003; Körtzinger et al., 2003;
49	Quay et al., 2007; Sonnerup & Quay, 2012; Quay et al., 2017). Moreover, $\delta^{13}$ C-DIC can offer an
50	estimate of net community production (Quay et al. 2009; Yang et al. 2019) and aid in
51	distinguishing DIC sources and sinks (Samanta et al. 2015), elucidating DIC dynamics across
52	estuaries and coastal waters (Kwon et al. 2021; Yang et al. 2018).
53	The lack of $\delta^{13}$ C-DIC data limits understanding of marine carbonate system changes, with
54	only 15 % of the ocean basin and fewer coastal samples analyzed for $\delta^{13}$ C-DIC compared to DIC
55	(Bauer et al. 2001; Becker et al. 2016). This scarcity results from the high costs and extensive
56	labor associated with traditional Isotope Ratio Mass Spectrometry (IRMS) analysis, along with
57	the demanding requirements for space and careful handling in the preservation and transportation
58	of samples from shipboard to shore-based laboratories. Recent developments in laser-based

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optical spectroscopy, like Cavity Ring-Down Spectroscopy (CRDS), have achieved a short-term laboratory precision to 1.5  $\mu$ mol kg<sup>-1</sup> for DIC concentration and 0.09 ‰ for  $\delta$ <sup>13</sup>C-DIC (Call et al. 2017; Su et al. 2019), approaching the guidelines of essential ocean variables set by the Global Ocean Observing System (GOOS), precisely,  $\pm 2 \mu \text{mol kg}^{-1}$  for DIC concentration and  $\pm 0.05 \%$ for  $\delta^{13}$ C-DIC. Until now, most  $\delta^{13}$ C-DIC analyses remain restricted to land-based laboratories, with storage and transportation introducing potential accuracy-reducing artifacts. Delays in processing at high-quality facilities further exacerbate this issue (Humphreys et al. 2015) with accuracy potentially dropping by about 0.1 % after six months and nearly 0.2 % after 18 months of storage (Olack et al. 2018). Challenges in expanding the application of CRDS-based instruments for onboard measurements come from the manual and time-intensive procedures to handle the large volume of samples. Becker et al. (2012) first used a continuous wave CRDS analyzer together with an air-sea equilibrator onboard for underway  $\delta^{13}$ C measurements of the oceanic CO<sub>2</sub>. However, converting the  $\delta^{13}$ C-CO<sub>2</sub> values to  $\delta^{13}$ C-DIC values required additional calculations based on the isotope fractionation, potentially introducing errors from fractionation factor determination across various conditions (Zhang et al. 1995), limiting the uncertainty to  $\pm 0.35$  % (Becker et al. 2012). Su et al. (2019) developed a novel analyzer by coupling a CO<sub>2</sub> acidification and extraction device with a CRDS detector to simultaneously measure DIC concentration and  $\delta^{13}$ C-DIC values. Building on this work, Deng et al. (2022) enhanced the method by incorporating a multi-port valve, enabling automatic sample loading and measurement. Nevertheless, the applicability of this approach for extended maritime expeditions remains unassessed and further improvement on the precision is desirable. The absence of stable in-house standards or commercial reference solutions for seawater  $\delta^{13}$ C-DIC ranges is a key restriction for the

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82 precision and accuracy of shipboard measurements (Cheng et al. 2019). Addressing systematic 83 drift in  $\delta^{13}$ C-DIC over extended, uninterrupted long-term measurements remains essential. 84 This study introduces a protocol based on the CRDS-based analyzer for onboard DIC and  $\delta^{13}$ C-DIC analysis, detailing its uncertainty and operational efficiency during a 40-day 85 86 expedition along the North American eastern ocean margin. Successfully analyzing 1666 87 samples at 30 samples per day per analyzer, this work represents the first collection of an 88 extensive  $\delta^{13}$ C-DIC dataset on a long cruise. Our results also affirm the consistency and 89 reliability of in-house sodium bicarbonate (NaHCO3) solutions, and the certified reference 90 material (CRM) for oceanic CO<sub>2</sub> measurements from Scripps Institute of Oceanography 91 (Dickson et al. 2007) as reference standards for  $\delta^{13}$ C-DIC. 92 Materials and procedure Preparation of in-house standards 93 We employed three seawater-like NaHCO<sub>3</sub> solutions with  $\delta^{13}$ C-DIC values around -1 % 94 95 (SB-1), -4 ‰ (SB-2), and 1 ‰ (SB-3) as in-house reference materials. These were used to accurately measure DIC concentrations and  $\delta^{13}$ C-DIC values, aligning with the oceanic  $\delta^{13}$ C-96 DIC range of -4 % to 3 %, especially within the narrower range of most Atlantic waters (Cheng 97 et al. 2019). All  $\delta^{13}$ C values reported in this study are expressed relative to the reference standard 98 99 Vienna PeeDee Belemnite (V-PDB). 100 To prepare SB-1 and SB-2 standards, we dissolved baking soda (NaHCO<sub>3</sub>) from Best Yet® (USA) and ARM & HAMMER<sup>TM</sup> (USA) with  $\delta^{13}$ C values of -0.99 % and -4.19 %, 101 102 respectively, in ultrapure water (resistivity 18.2 M $\Omega$  cm) purged with CO<sub>2</sub>-free air. Addressing 103 two challenges, the unavailability of commercial NaHCO<sub>3</sub> with  $\delta^{13}$ C > 0 %, and the poor 104 solubility of isotopically heavy calcite (CaCO<sub>3</sub>) in seawater-like solutions, we developed an inhouse standard (SB-3) by mixing -0.99 \% valued baking soda and \frac{13}{C} labeled NaHCO<sub>3</sub> (99 \% atom % <sup>13</sup>C, Cambridge Isotope Laboratories, USA), following the procedure detailed in Appendix S1. Briefly, 0.012 g of <sup>13</sup>C labeled NaHCO<sub>3</sub> was dissolved in 10 mL of CO<sub>2</sub>-free water for the stock solution. We mixed 100  $\mu$ L of this stock with 5.000 g of the baking soda in CO<sub>2</sub>free water for an expected  $\delta^{13}$ C-DIC value of 1.12 \%. We adjusted the DIC concentration of all in-house standards to  $\sim 2000 \, \mu \text{mol L}^{-1}$ . The in-house standards were preserved with saturated HgCl<sub>2</sub> (0.025 % vol./vol.) and stored in 4 L aluminum-coated, gas-tight bags (Calibrated Instruments Inc., USA), ceasing use when the volume reduced to one-sixth of 4 L to minimize the impacts of gas exchange and possible other changes. We aged all in-house standards for one month before usage. This process allowed us to: (a) verify that the  $\delta^{13}$ C-DIC values of our standards remained constant during storage, (b) ensure complete isotopic equilibration within the solution, and (c) detect any potential contamination. The DIC concentrations of in-house standards were regularly calibrated against CRMs from Batch #197 (2115.23  $\pm$  0.53  $\mu$ mol kg<sup>-1</sup>) and #199 (2021.66  $\pm$  0.52  $\mu$ mol kg<sup>-1</sup>). Detailed information about these batches is available on the Ocean Carbon and Acidification Data System (OCADS) website (https://www.ncei.noaa.gov/access/ocean-carbon-acidification-datasystem/oceans/Dickson\_CRM/batches.html). Additionally, we subsampled in-house standards into 12 mL Exetainer® vials (Labco Limited, UK) weekly at sea to check their stability during usage. Once back on land, these vials were sent to University of California Davis Stable Isotope Facility for  $\delta^{13}$ C-DIC analysis using the headspace equilibration technique (Atekwana and Krishnamurthy 1998), employing a GasBench II system linked to a Delta Plus XL IRMS (Thermo Scientific, Bremen, Germany). These IRMS-derived  $\delta^{13}$ C-DIC values then were used to calibrate our CRDS  $\delta^{13}$ C-DIC measurements.

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#### Collection of seawater samples

During the ship-based repeated hydrographic observations, discrete seawater samples for DIC and  $\delta^{13}$ C-DIC were collected according to best practices (Dickson et al. 2007) from a profiling Conductivity, Temperature, and Depth (CTD) instrument paired with Niskin bottles. One or two duplicate samples were taken at each station. Pre-combusted (550 °C for 4 h) 250 mL borosilicate glass bottles were rinsed three times with the sample seawater before being filled from the bottom, allowing it to overflow for approximately twice the time needed to fill the bottle to the top. Bottles were capped and left in the room for about 30 min (to bring cold deepwater samples to near room temperature). Then, 1 mL of water was extracted from each bottle to allow thermal expansion, and 50  $\mu$ L of saturated HgCl<sub>2</sub> solution was added to poison biological activities. Sample bottles were sealed with Apiezon-L grease, and stoppers were fixed with rubber bands and clips. The samples were stored at room temperature for at least 24 h before onboard analysis or in coolers for transporting back to the home laboratory. Underway samples for DIC concentrations and  $\delta^{13}$ C-DIC analyses were collected every 2 h from the ship's flow-through system during transits between stations. The samples were stored at room temperature for 2–3 h, and no HgCl<sub>2</sub> was added before onboard analysis.

# **Experimental setup**

A G2131-i Isotope and Gas Concentration CRDS Analyzer (Picarro, USA) was employed along with an AS-D1  $\delta^{13}$ C-DIC Analyzer (Apollo SciTech, USA) for sample injection, CO<sub>2</sub> extraction, instrument control, and data acquisition in simultaneous DIC concentration and  $\delta^{13}$ C-DIC measurements. This system and its accessories took up < 2 m of laboratory bench space (Figure 1).

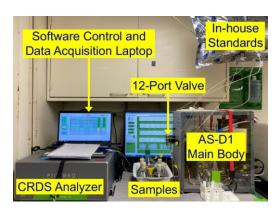


Figure 1. Photograph of the DIC/ $\delta^{13}$ C-DIC analytical equipment installed onboard NOAA Ship Ronald H. Brown.

The whole system is comprised of four components: (a) sample injection module, (b) CO₂ extraction module, (c) detection module, and (d) data processing and control module (Figure 2), similar to a previously described system (Deng et al. 2022; Su et al. 2019). The analytical procedure began with drawing 0.7 mL of phosphoric acid brine (2 % vol./vol. H₃PO₄ with 7 % wt./vol. NaCl) into a 10 mL syringe by the Cavro® XLP 6000 digital syringe pump (Precision ≤ 0.05 %, Tecan, USA) coupled to a 12-port valve and followed up by injection of the acid brine into the reactor. This step also cleaned residues from the previous cycle. While this pre-acid was bubbled in the reactor with a CO₂-free air stream, an additional 0.9 mL of the acid brine was drawn into the syringe, followed by a 6.5 mL sample (or standard). The excess of acid brine ensured that all DIC in the sample could completely convert to CO₂. Note the sample volume has been increased from our previous practice of 3.0–3.5 mL (Su et al. 2019). This larger volume ensured the CO₂ concentration remained within the instrument's optimal detection range for longer time, thus leading to more precise δ¹³C measurements. Once a stable baseline of near zero CO₂ was reached in the reactor and the CO₂ detector, the sample and acid brine in the syringe

were injected into the reactor at a controlled low speed to allow the acid brine to clear the sample DIC attached to the syringe wall into the reactor, where all carbonate species were converted to  $CO_2$ . The  $CO_2$  was extracted and carried to the CRDS analyzer at a rate of 60 mL min<sup>-1</sup> by  $CO_2$ -free compressed air from a  $\frac{40 \text{ L}}{10}$  cylinder, sufficient for 20 days of continuous analysis for approximately 700 samples. A preceding condenser was used to minimize water vapor interference (Pohlman et al. 2021). The CRDS concurrently reported  $CO_2$  concentration ( $^{12}CO_2 + ^{13}CO_2$ ) and  $\delta^{13}C$ - $CO_2$  values at 1 Hz for about 500 s, with data similarly captured by the AS-D1's data processing and control module. The analytical cycle would complete when  $CO_2$  levels drop below a set threshold (i.e., the deviation between 15 successive data points of  $CO_2$  reading was less than 5 ppm above the initial baseline), followed by a  $\frac{120 \text{ s}}{120 \text{ s}}$  purge with carrier gas before the next cycle. Measurements occur under room temperature ( $20 \pm 1$  °C), each lasting about 13 min. The timeline of the entire analytical process is detailed in Table S1.

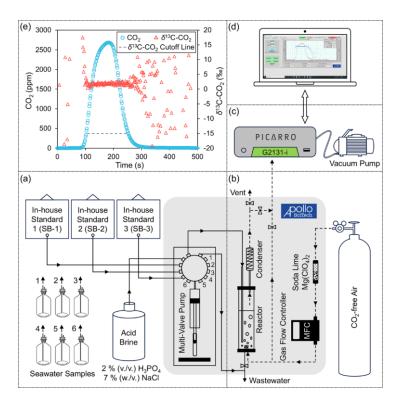


Figure 2. The schematic of the dissolved inorganic carbon (DIC) concentration and stable isotopic composition of DIC ( $\delta^{13}$ C-DIC) analytical system is subdivided into four distinct modules: (a) the sample injection module, (b) the CO<sub>2</sub> extraction module, (c) the detection module, and (d) the data processing and control module; and (e) a typical output showing data collected for one measurement of CO<sub>2</sub> concentration and stable isotopic composition of CO<sub>2</sub> ( $\delta^{13}$ C-CO<sub>2</sub>). Solid lines represent the flow of liquid, while dashed lines denote the flow of gas.

# Calibrations and corrections

To determine the DIC concentration, we calculated the net CO<sub>2</sub> integration area by integrating the CO<sub>2</sub> concentration increase above baseline over time. A least square fitted line was developed to correlate net integration area with DIC mole amounts. This calibration covered

a DIC concentration range of 1700 to 2300  $\mu$ mol L<sup>-1</sup>, using daily measurements of three volumes (5.5, 6.5, and 7.5 mL) of either in-house standard SB-1 or CRM. The density determined from recorded temperature and salinity measured in situ by the SBE 9plus CTD (accuracy  $\leq$  0.003 PSU, Seabird Scientific, USA) allowed for converting volume-based DIC concentrations to  $\mu$ mol kg<sup>-1</sup>.

The  $\delta^{13}$ C-CO<sub>2</sub> value of the DIC was simultaneously assessed. However, the Picarro G2131-i exhibited significant noise at low CO<sub>2</sub> concentrations (Figure 2e), as indicated by the manufacturer, with precision for  $\delta^{13}$ C under 0.1 ‰ above 380 ppm CO<sub>2</sub> and 0.05 ‰ above 1000 ppm CO<sub>2</sub>. To reduce noise, we applied a 400 ppm CO<sub>2</sub> cutoff. The CO<sub>2</sub> concentration-weighted mean  $\delta^{13}$ C-CO<sub>2</sub> ( $\delta^{13}$ C<sub>mean</sub>) for each analysis was calculated using eq 1, incorporating both raw  $\delta^{13}$ C-CO<sub>2</sub> ( $\delta^{13}$ C<sub>raw</sub>) data and net CO<sub>2</sub> concentration (CO<sub>2net</sub>) readings from the CRDS at every time point.

$$\delta^{13}C_{\text{mean}} = \frac{\sum_{\text{CO}_{2\text{net}}} \times \delta^{13}C_{\text{raw}}}{\sum_{\text{CO}_{2\text{net}}}} \text{(CO}_{2\text{net}} > 400 \text{ ppm)}$$
(1)

Due to the logistical complexities of implementing standard gas setups on a ship, we did not adopt the built-in  $\delta^{13}$ C-CO<sub>2</sub> calibration program of the G2131-i CRDS system. Instead, leveraging multiple in-house standards with pre-calibrated  $\delta^{13}$ C-DIC values facilitated the correction of  $\delta^{13}$ C<sub>mean</sub> inaccuracies. To balance the need for frequent calibrations with the onboard sample processing efficiency, a calibration using one of the three in-house standards was conducted following analysis of every eight seawater samples. This procedure, detailed in Table S2, ensured each standard was assessed a minimum of three times daily. The  $\delta^{13}$ C<sub>mean</sub> values for each in-house standard, derived from its adjacent measurements, were used in a time-based linear regression model (eq 2) to track the instrumental drift and estimate the value of the standard's  $\delta^{13}$ C signal ( $\delta^{13}$ C<sub>est</sub>) at the time of each sample measurement. This enabled the

establishment of a separate three-point calibration curve ( $R^2 > 0.999$ ) for each measurement, incorporating the  $\delta^{13}C_{est}$  and the exact  $\delta^{13}C$ -DIC values of three in-house standards.

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$$\delta^{13}C_{\text{est}}(t) = \frac{\delta^{13}C_{\text{mean}}(t_1) - \delta^{13}C_{\text{mean}}(t_0)}{t_1 - t_0} \times (t - t_0) + \delta^{13}C_{\text{mean}}(t_0) \quad (2)$$

In our approach, each sample or reference material was subjected to a minimum of two and up to four consecutive measurements to achieve the preset relative standard deviation (RSD) of 0.001 for the net integration area and 0.06 for the CO<sub>2</sub>-weighted mean of  $\delta^{13}$ C-CO<sub>2</sub>. From these measurements, we selected two "valid" rounds that met our precision criteria, and the final DIC concentrations and  $\delta^{13}$ C-DIC results were always reported as an average of these two valid rounds. In addition, CRM Batch #188 and #195 were randomly included in the sample sequence as quality checks for DIC concentrations and  $\delta^{13}$ C-DIC analysis.

### Field work

During the East Coast Ocean Acidification Cruise aboard NOAA Ship Ronald H. Brown in the summer of 2022 (ECOA 2022), the performance of our DIC and  $\delta^{13}$ C-DIC analytical system was extensively evaluated. The cruise, initially surveyed the Gulf of Maine and the Mid-Atlantic Bight (Leg 1), followed by a survey of the South Atlantic Bight (Leg 2). Over 40 days, we collected 1972 discrete CTD samples, including 186 duplicates from 228 water column stations, plus 126 samples from the ship's underway water supply line (Figure 3). Of these, 1666 samples were analyzed onboard, supported by 480 measurements of in-house standards and CRMs to validate our method, while the rest were analyzed ashore within a month.

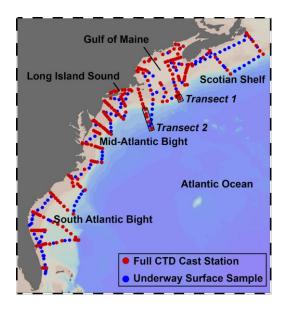


Figure 3. Map showing the study area and sampling locations of the ECOA 2022 cruise.

- Transect 1 and Transect 2 show locations of selected deep-water stations with a water depth of >
- 235 2000 m for comparisons with historical data.

to be evaluated before overall uncertainty estimation.

# Assessment and discussion

# Stability of in-house standards

While we could periodically calibrate the in-house DIC standards using the CRM when on board, the accuracy of  $\delta^{13}$ C-DIC analyses primarily relied on the stability of our three in-house standards throughout the cruise as no CRM for  $\delta^{13}$ C-DIC is available to our community. Therefore, the stability of our in-house standards plays a critical role in ensuring the accuracy and consistency of both DIC and  $\delta^{13}$ C-DIC analyses, particularly on extended cruises, and needs

Figure 4 demonstrates the exceptional consistency of the  $\delta^{13}$ C-DIC values of our in-house standards, as verified by IRMS over two months of onboard and post-cruise use, with average

 $\delta^{13}$ C-DIC values of  $-0.95 \pm 0.02$  % for SB-1,  $-4.20 \pm 0.03$  % for SB-2, and  $1.09 \pm 0.02$  % for SB-3 (n = 6). Moreover, these values closely aligned with their preparation sources (-0.99 % for solid SB-1, -4.19 % for solid SB-2, and 1.12 % expected for SB-3). These validated average  $\delta^{13}$ C-DIC values hence served as our calibration references.

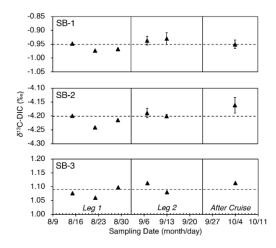


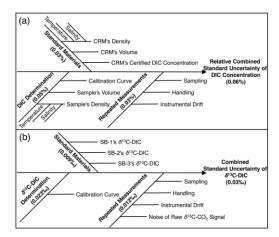
Figure 4. The stable isotopic composition of DIC ( $\delta^{13}$ C-DIC) values measured by Isotope Ratio Mass Spectrometry (IRMS) for three in-house standards periodically subsampled at sea and after the cruise. The error bars indicate the standard deviation of  $\delta^{13}$ C-DIC for in-house standards stored in different gas-tight bags. The dashed lines show the average  $\delta^{13}$ C-DIC value for each in-house standard.

This proven stability affirms our preparation and preservation method for in-house standards as effective for long-term  $\delta^{13}$ C-DIC seawater analysis. The depletion of solutions in aluminum-coated bags to about one-sixth of their original volume did not notably alter the  $\delta^{13}$ C-DIC. The method's adaptability in creating reference materials with precise  $\delta^{13}$ C-DIC values enriches its utility across varied aquatic environments. While our findings advocate for

theoretical or expected values' reliability in calibration, further experimental validations and broader analytical method comparisons remain essential for affirming these standards' uniform stability and consistency across different laboratories.

## Overall uncertainty of the method

The uncertainties for DIC concentration and  $\delta^{13}$ C-DIC measurements stemmed from three main sources: standard material variations, determination processes, and repeated measurement variabilities. Figure 5 shows these uncertainties, with detailed calculations in Appendices S2 and S3.



**Figure 5.** The sources of uncertainties for (a) the dissolved inorganic carbon (DIC) concentration and (b) the stable isotopic composition of DIC ( $\delta^{13}$ C-DIC) measurements. Numbers in the brackets indicate the values of relative standard uncertainties for the DIC concentration and the standard uncertainties for the  $\delta^{13}$ C-DIC from different parts of sources.

We especially evaluated the uncertainty of repeated measurements by successively measuring eight replicate seawater samples sequentially drawn from one Niskin bottle at 226 m depth and processed identically. Analyzed in random order (3, 1, 6, 5, 2, 4, 7, 8), a discernible

increase in  $\delta^{13}$ C-DIC was noted from the sixth sample onwards (Figure 6). The average  $\delta^{13}$ C-DIC was  $0.34 \pm 0.01$  % (1 $\sigma$ ) for the first five samples and  $0.40 \pm 0.01$  % for the last three samples, suggesting potential <sup>13</sup>C-DIC gas exchange with headspace air when only half the volume of seawater was left in the Niskin bottle. During the sampling process,  $\delta^{13}$ C-DIC samples were collected after DO, pH, and DIC samples for NOAA lab analysis, with about 1 L of water used per  $\delta^{13}$ C-DIC bottle. Each sample type typically required ~ 2 min to collect (doubling for replicates), resulting in a total elapsed time of 8-10 min from the Niskin bottle's initial opening to  $\delta^{13}$ C-DIC sampling. The difference in DIC concentrations among the eight samples was not significant, with the first five samples having an average DIC concentration of  $2174.3 \pm 0.5 \mu mol$ kg<sup>-1</sup> and the average DIC concentration of the last three samples being 2174.6  $\pm$  0.3  $\mu$ mol kg<sup>-1</sup>. We excluded the last three (No. 6, 7, 8) to eliminate potential sampling bias and reported a standard deviation of 0.8  $\mu$ mol kg<sup>-1</sup> (RSD = 0.04 %) for DIC concentrations and 0.017 % for  $\delta^{13}$ C-DIC of the ten repeated analyses of the first five duplicates, as each was measured twice. In our approach, the DIC concentrations and  $\delta^{13}$ C-DIC results are always reported as an average of two repeatable analyses; thus, the standard uncertainty of the repeated measurements was 0.6  $\mu$ mol kg<sup>-1</sup> (RSD = 0.03 %) for DIC concentrations and 0.012 % for  $\delta$ <sup>13</sup>C-DIC. This reflects the residual effects of random errors in sampling, handling, and instrumental drift after calibration and correction procedures are applied.

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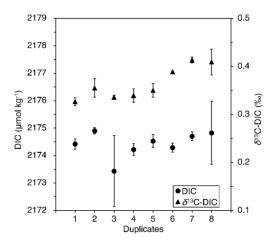


Figure 6. Dissolved inorganic carbon (DIC) concentrations and stable isotopic composition of DIC ( $\delta^{13}$ C-DIC) values of eight duplicate seawater samples collected at a depth of 226 m. The two ends of the error bar indicate the results of two rounds of measurements, and the symbol

indicates the mean value.

To conclude, the relative combined standard uncertainty of DIC concentration was 0.06 %  $(1\sigma)$ , or 1.2  $\mu$ mol kg<sup>-1</sup> at a DIC concentration of ~ 2000  $\mu$ mol kg<sup>-1</sup>. Meanwhile, the combined standard uncertainty for the onboard measurement of  $\delta^{13}$ C-DIC was 0.03 %  $(1\sigma)$ . These uncertainties satisfy not only the recommended precisions of GOOS but also compare favorably to conventional methods. For instance, the coulometry method with Single-Operator Multiparameter Metabolic Analyzer (SOMMA) and the non-dispersive infrared absorption (NDIR) method report uncertainties for DIC concentrations between 1.19 to 1.65  $\mu$ mol kg<sup>-1</sup> (Johnson 1992; Johnson et al. 1985; Johnson et al. 1999; Johnson et al. 1987) and 2  $\mu$ mol kg<sup>-1</sup> (Huang et al. 2012), respectively, while the best-reported uncertainty for  $\delta^{13}$ C-DIC via IRMS is about 0.03 % based on a 100 mL sample (Quay et al. 2007; Quay et al. 2003), with other laboratories often reporting around 0.1 % based on smaller sample volume of 1–2 mL (Cheng et

al. 2019). We suggest that the methodologies employed in our study are as precise as existing techniques, validating the reliability of the onboard measurements.

### Evaluation of onboard analytical performance

## Repeatability

The ECOA 2022 cruise analyzed 186 replicate samples from 228 CTD stations, covering depths from the sea surface to 4600 m. The DIC concentrations of these samples ranged between 1900 and 2250  $\mu$ mol kg<sup>-1</sup>, and the  $\delta^{13}$ C-DIC values varied from -0.5 % to 1.8 %. Excluding four pairs of abnormal data with a DIC concentration difference greater than 10  $\mu$ mol kg<sup>-1</sup> and  $\delta^{13}$ C-DIC difference greater than 0.2 %, the mean absolute differences were  $1.6 \pm 1.5 \,\mu$ mol kg<sup>-1</sup> for DIC and  $0.05 \pm 0.04$  % for  $\delta^{13}$ C-DIC ( $1\sigma$ , n = 182), both within  $2\sigma$  of the overall uncertainties of the method.

Moreover, repeatability in measuring DIC concentration and  $\delta^{13}$ C-DIC across coastal samples remained consistent, unaffected by the sample's DIC concentration (Figure 7). Injecting 6.5 mL of seawater with a minimum DIC concentration of 1900  $\mu$ mol kg<sup>-1</sup> produced peak CO<sub>2</sub> signal between 2600–3000 ppm and sustained concentrations above 2000 ppm for at least 90 s, above 1000 ppm for 120 s, and above 400 ppm for 150 s (data not presented). The high CO<sub>2</sub> concentration with an extended duration is sufficient and critical to secure a stable CO<sub>2</sub>-weighted mean of  $\delta^{13}$ C-CO<sub>2</sub> for accurate  $\delta^{13}$ C-DIC determination, with a 400-ppm CO<sub>2</sub> concentration

Onboard samples showed a mean absolute difference of 1.5  $\pm$  1.4  $\mu$ mol kg<sup>-1</sup> for DIC and 0.05  $\pm$ 

et al. 2022; Su et al. 2019). Furthermore, comparisons between onboard and shore-based

measurements of 136 onboard and 46 shore-based pairs revealed consistent performance.

cutoff. To achieve this, we have nearly doubled sample volume from our previous practice (Deng

0.04 ‰ for  $\delta^{13}$ C-DIC, while shore-based analyses had similar discrepancies,  $1.8 \pm 1.8 \,\mu \text{mol kg}^{-1}$  for DIC concentration and  $0.04 \pm 0.04$  ‰ for  $\delta^{13}$ C-DIC, confirming the method's reliability.

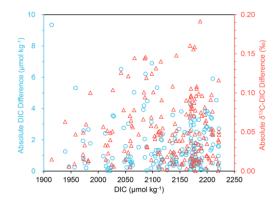


Figure 7. The absolute dissolved inorganic carbon (DIC) concentration differences (blue circles) and stable isotopic composition of DIC ( $\delta^{13}$ C-DIC) differences (red triangles) against the DIC concentrations of discrete replicate samples collected during the cruise. 4 out of 186 pairs of duplicate measurements with a DIC concentration difference greater than 10  $\mu$ mol kg<sup>-1</sup> and  $\delta^{13}$ C-DIC difference greater than 0.2 ‰ were excluded in advance.

## Accuracy evaluation

For method validation, we utilized CRMs. Our in-house standards SB-1, SB-2, and SB-3 were initially calibrated using CRMs from Batches #197 and #199. Throughout the cruise, we analyzed 43 bottles of CRMs as quality control samples: 36 from Batch #188 and 7 from Batch #195. The results of these analyses, including DIC concentration and  $\delta^{13}$ C-DIC measurements, are summarized in Table 1.

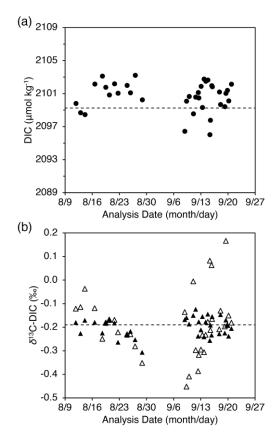
**Table 1.** Summary of statistical properties for measured dissolved inorganic carbon (DIC) concentrations and stable isotopic composition of DIC ( $\delta^{13}$ C-DIC) in certified reference materials (CRMs) from Batch #188 and #195.

	CRM #188		CRM #195	
	DIC ( $\mu$ mol kg <sup>-1</sup> )	$\delta^{13}$ C-DIC (‰)	DIC (μmol kg <sup>-1</sup> )	$\delta^{13}$ C-DIC (‰)
Average	2100.7	-0.20	2026.0	0.88
Standard deviation	1.7	0.04	1.1	0.03
Median	2101.1	-0.19	2026.2	0.88
Maximum	2103.2	-0.12	2027.3	0.93
Minimum	2096.0	-0.31	2024.8	0.84
n	36	36	7	7

Note: The certified DIC concentrations for CRM Batch #188 and #195 are  $2099.26 \pm 0.52~\mu mol\ kg^{-1}$  and  $2024.96 \pm 0.52~\mu mol\ kg^{-1}$ , respectively.

We evaluated the bias in DIC measurements by comparing our results (Figure 8a) with the certified values of CRMs, finding average discrepancies of  $1.4 \pm 1.7 \,\mu\text{mol kg}^{-1}$  for CRM #188 and  $1.0 \pm 1.1 \,\mu\text{mol kg}^{-1}$  for CRM #195. Statistical analysis through two one-tailed *t*-tests, at a 99.5 % confidence interval, yielded *p*-values less than 0.001, demonstrating that our measured DIC concentrations were statistically higher than the certified values for both CRM batches. The observed discrepancy in DIC measurements was linked to temperature fluctuations of in-house standards affecting their density. The aluminum bags holding the standards were hung near an AC vent on the ceiling, likely causing their temperatures to diverge from recorded values as the thermometer was placed close to the sample bottles. This situation, evidenced by a hypothetical 2 °C standard temperature deviation altering measured DIC concentration by ~ 1  $\mu$ mol kg<sup>-1</sup>, remained within the GOOS's  $\pm 2 \,\mu$ mol kg<sup>-1</sup> accuracy range, hence no adjustments were made in the current study. Future measures will include attaching thermometers directly to the standard

bags or repositioning them away from AC influences to ensure consistent temperature management.



**Figure 8.** Measured (a) DIC concentrations (filled circles) and (b) stable isotopic composition of DIC ( $\delta^{13}$ C-DIC) values (filled triangles) of certified reference materials (CRMs) from Batch #188 relative to the analysis date (n=36). The dashed lines show the average DIC and  $\delta^{13}$ C-DIC values of CRM #188 measured during the 40-day onboard period. The empty triangles indicate raw  $\delta^{13}$ C-DIC values derived from single-point calibration without employing a time-dependent linear regression method for correction, highlighting the long-term instrument drift.

The accuracy of  $\delta^{13}$ C-DIC analysis and the stability of the analyzer were first examined by directly comparing CRDS with IRMS measurements on the CRM from Batch #188. Duplicate IRMS analysis at the University of California Davis Stable Isotope Facility of an unopened CRM bottle provided a reference  $\delta^{13}$ C-DIC value of  $-0.19 \pm 0.02$  %. Our CRDS-based method against in-house standards produced an average  $\delta^{13}$ C-DIC value of  $-0.20 \pm 0.04$  % with a median of -0.19 ‰ across 36 CRM bottles. This close agreement with the IRMS results corroborates our analytical system's precision and matches or surpasses previously documented accuracies, varying from 0.03 % to 0.23 % across different methodologies (Bass et al. 2012; Cheng et al. 2019; Su et al. 2019). The standard deviation was 0.04 % for  $\delta^{13}$ C-DIC measurements of 36 CRM bottles from Batch #188 throughout the cruise, indicating high stability for long-term onboard isotopic analyses. Enhanced measurement consistency was achieved through a timebased linear regression calibration and correction model, significantly reducing  $\delta^{13}$ C-DIC variability compared to uncorrected results, which had a higher standard deviation of 0.13 % (Figure 8b). The minimal standard deviations for  $\delta^{13}$ C-DIC of CRM Batches #188 (0.04 %) and #195 (0.03 %) underscore their reliability as consistent liquid standards for  $\delta^{13}$ C-DIC analyses in seawater. A previous work by Cheng et al. (2019) also revealed a considerable narrowing of measurement variations from 0.10 % to 0.06 % in an international intercomparison study after applying CRM for interlaboratory correction . A key advantage to adopting CRM as a  $\delta^{13}$ C-DIC reference material lies in its wide availability within the marine carbonate chemistry community. If the  $\delta^{13}$ C-DIC of CRM from a subset of batches can be certified before distribution, the  $\delta^{13}$ C measurement community could calibrate their secondary in-house standard using the CRM, thus increasing the interlaboratory consistency. This approach positions CRM as a comprehensive

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standard for DIC concentration and  $\delta^{13}$ C-DIC measurements, simplifying quality control protocols.

## Interlaboratory reproducibility of DIC analysis

To assess inter-laboratory consistency, DIC concentrations measured by our CRDS method were compared with coulometry measurements by the National Oceanic and Atmospheric Administration (NOAA)'s Atlantic Oceanographic & Meteorological Laboratory (AOML), using 1723 samples analyzed by the SOMMA system during the same cruise (Johnson 1992; Johnson et al. 1985; Johnson et al. 1999; Johnson et al. 1987). After outlier detection using interquartile ranges (Rousseeuw and Hubert 2011), a satisfactory agreement was found (Figure 9), with an average difference of  $2.4 \pm 3.8 \,\mu$ mol kg<sup>-1</sup> between CRDS and coulometry methods, indicating an acceptable accuracy range for onboard measurements. Compared to the discrepancy of onboard analyses  $(2.0 \pm 3.8 \,\mu$ mol kg<sup>-1</sup>, n = 1278), that of shore-based laboratory result  $(3.5 \pm 3.7 \,\mu$ mol kg<sup>-1</sup>, n = 386) was slightly higher (p < 0.001 at a 99.5 % confidence interval), suggesting that transportation and storage might impact DIC concentrations. The correlation coefficient of 0.298 between discrepancies and DIC concentrations demonstrated that our CRDS method is adequate for a wide range of DIC concentrations in oceanic and coastal waters.

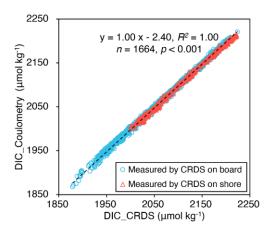


Figure 9. Dissolved inorganic carbon (DIC) concentration results measured by Cavity Ring-Down Spectroscopy (CRDS) on board (blue circle) or on shore (red triangle) plotted against DIC concentrations obtained through onboard coulometry measurements conducted by National Oceanic and Atmospheric Administration (NOAA)'s Atlantic Oceanographic & Meteorological Laboratory (AOML).

# $\delta^{13}$ C-DIC comparison with historical data

As there is no analysis of the same water with IRMS for comparison, we make a comparison with historical data at the offshore stations (Figure 10a), which had been occupied during the World Ocean Circulation Experiment (WOCE) A22 cruise in 1997 (Transect 1) and the Global Ocean Ship-based Hydrographic Investigations Program (GO-SHIP) A22 cruises in 2021 and 2012 (Transect 2) (Olsen et al. 2020). During these cruises,  $\delta^{13}$ C-DIC samples collected in 500 mL bottles were analyzed post-cruise at the National Ocean Sciences Accelerator Mass Spectrometry Facility, with a replication of  $\pm$  0.03 ‰ (McNichol et al. 2010). In the offshore stations along both Transect 1 and Transect 2, we can observe the decrease of  $\delta^{13}$ C-DIC over time in all water masses, that is 1997 (Figure 10c) over 2022 (Figure 10b) and

# surface waters of the Gulf Stream (GS).

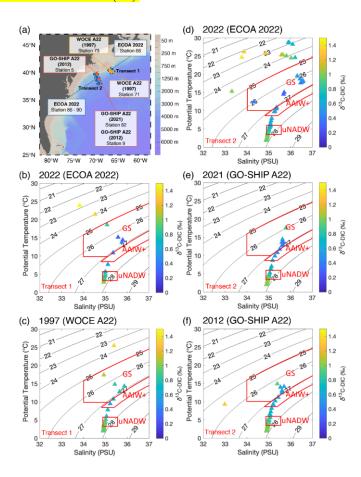


Figure 10. (a) Locations of selected deep-water stations with a water depth of > 2000 m for comparison with historical data. These stations were occupied during the East Coast Ocean Acidification (ECOA) 2022 cruise (blue circles) and their nearby stations visited during the World Ocean Circulation Experiment (WOCE) A22 cruise in 1997 (yellow circles) and the Global Ocean Ship-based Hydrographic Investigations Program (GO-SHIP) A22 cruises in 2021

and 2012 (red circles). The stable isotopic composition of DIC ( $\delta^{13}$ C-DIC) overlay Temperature-Salinity (T-S) diagrams show the  $\delta^{13}$ C-DIC of different water masses in full water columns at Transect 1 in (b) 2022 (ECOA 2022) and (c) 1997 (WOCE A22), and the  $\delta^{13}$ C-DIC in different water masses at Transect 2 in (d) 2022 (ECOA 2022), (e) 2021 (GO-SHIP A22), and (f) 2012 (GO-SHIP A22). GS, AAIW+, and uNADW denote the Gulf Stream water, the Antarctic Intermediate Water and other intermediate waters, and the upper layer of the North Atlantic Deep Water, respectively.

In our 2022 transects (Figure 11), surface  $\delta^{13}$ C-DIC varied widely (0.64–1.56 ‰), inversely correlating with DIC concentrations due to photosynthesis. Phytoplankton preference for  $^{12}$ C during photosynthesis leads to  $^{13}$ C-enriched DIC in surface waters (Ge et al. 2022). Below the surface mixed layer, the  $\delta^{13}$ C-DIC minimum (0.28–0.46 ‰) at 70–200 m reflected organic matter remineralization. Concurrently, the DIC concentration peaked at about 2200  $\mu$ mol kg $^{-1}$  in the oxygen minimum zone (200–400 m). The observed mismatch between the minimum  $\delta^{13}$ C-DIC at shallower depths and the maximum DIC concentration may result from two primary processes. Firstly, atmospheric CO<sub>2</sub> Suess effect (that is  $\delta^{13}$ C-CO<sub>2</sub> becomes more negative with time) and its invasion into the ocean introduced a progressively lighter  $\delta^{13}$ C-CO<sub>2</sub> signal, which affects the upper ocean  $\delta^{13}$ C-DIC relatively more substantially than the DIC concentration increase. Secondly, mixing colder, low-oxygen Antarctic Intermediate Water and other intermediate waters (AAIW+) with warmer Gulf Stream (GS) water shifts  $\delta^{13}$ C-DIC values positive below 100 m. This is because AAIW+, when formed at colder surface temperatures, had a more positive  $\delta^{13}$ C-DIC signal due to enhanced isotope fractionation during air-sea equilibrium (Broecker and Maier-Reimer 1992; Quay et al. 2017).

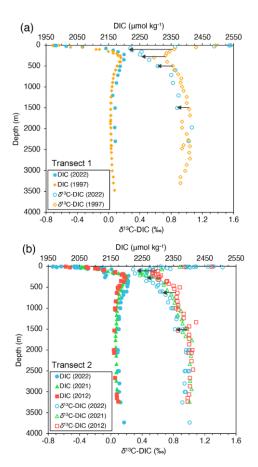


Figure 11. (a) The dissolved inorganic carbon (DIC) concentration and stable isotopic composition of DIC ( $\delta^{13}$ C-DIC) depth profiles measured during the East Coast Ocean Acidification (ECOA) 2022 cruise (circles) at Transect 1 compared to that measured during the World Ocean Circulation Experiment (WOCE) A22 cruise in 1997 (diamonds) at the same location. (b) The DIC and  $\delta^{13}$ C-DIC depth profiles measured at Transect 2 during the ECOA 2022 cruise (circles) compared to that measured at the exact location in 2021 (triangles) and Station 9 in 2012 (squares) during the Global Ocean Ship-based Hydrographic Investigations

Program (GO-SHIP) A22 cruises. Black arrows indicate the decrease of  $\delta^{13}$ C-DIC over the past few years. In the deep ocean, the  $\delta^{13}$ C-DIC increased with depth, stabilizing around 0.97 % at 2000 m due to mixing with the upper layer of the North Atlantic Deep Water (uNADW), while DIC concentration slightly dropped to around 2170  $\mu$ mol kg<sup>-1</sup>. Given the expectation that  $\delta^{13}$ C-DIC in deep ocean seawater remains stable over centuries, unaffected by anthropogenic carbon uptake (Cheng et al. 2019), we compared our 2022 measurements at depths beyond 2000 meters with historical data from similar locations during the 1997 WOCE A22 and the 2012 and 2021 GO-SHIP A22 cruises. Our findings reveal an average  $\delta^{13}$ C-DIC value of  $0.97 \pm 0.03 \%$  ( $1\sigma$ , n = 15), closely matching historical average of  $1.00 \pm 0.04$  % ( $1\sigma$ , n = 27), further affirming the accuracy of our CRDS  $\delta^{13}$ C-DIC analytical approach. In addition, the observed  $\delta^{13}$ C-DIC variations in the upper ocean point towards changes in biogeochemical processes or the impact of the Suess effect due to anthropogenic CO<sub>2</sub> uptake (Quay et al. 2017). Our analysis shows a marked decrease in  $\delta^{13}$ C-DIC over the decades (Figure 10 and 11), especially within the mixed layer, progressively lessening with depth to around 1500 meters. This decrease underscores the increased influence of anthropogenic carbon in shallower waters. For depth profiles taken at the two transects in 2022, the average  $\delta^{13}$ C-DIC values observed were  $0.50 \pm 0.16$  % for the Gulf Stream water,  $0.49 \pm 0.07$  % for the AAIW+, and  $0.77 \pm 0.06$  % for the uNADW. At stations along Transect 1, the  $\delta^{13}$ C-DIC values experienced a decrease of about 0.27 % in the Gulf Stream water, 0.26 % in the AAIW+, and 0.08 % in the uNADW, while the corresponding DIC concentration increased by 1.0  $\mu$ mol kg<sup>-1</sup>, 14.8  $\mu$ mol kg<sup>-1</sup> and 13.0  $\mu$ mol kg<sup>-1</sup>, respectively, in these water masses over the past 25 years. At stations along

Transect 2, the  $\delta^{13}$ C-DIC between 2022 and 2012 decreased by 0.50 % in the Gulf Stream water,

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0.10 ‰ in the AAIW+, and 0.10 ‰ in the uNADW, while the DIC concentration increase over the past decade were 29.9  $\mu$ mol kg<sup>-1</sup>, 14.3  $\mu$ mol kg<sup>-1</sup>, and 12.0  $\mu$ mol kg<sup>-1</sup>, respectively. Compared to the decadal changes in DIC concentration (6–12  $\mu$ mol kg<sup>-1</sup>), the decadal changes in  $\delta^{13}$ C-DIC (–0.1 ‰) are more distinguishable from seasonal variations (± 0.2 ‰ for  $\delta^{13}$ C-DIC and ± 30  $\mu$ mol kg<sup>-1</sup> for DIC concentration) and vertical trends (0.4–1.2 ‰ for  $\delta^{13}$ C-DIC and 160–240  $\mu$ mol kg<sup>-1</sup> for DIC concentration) (Gruber et al. 2002), thus making the  $\delta^{13}$ C-DIC signal potentially a more sensitive tool for detecting anthropogenic CO<sub>2</sub> accumulation. Given the uncertainty of 1.2  $\mu$ mol kg<sup>-1</sup> for DIC concentration and 0.03 ‰ for  $\delta^{13}$ C-DIC value, both parameters from our measurements are sufficient for studying their decadal variabilities in the ocean. A combined use of both datasets would provide a powerful approach for constraining anthropogenic CO<sub>2</sub> in the ocean.

### **Comments and recommendations**

The CRDS-based analyzer streamlines  $\delta^{13}$ C-DIC analysis with its operational efficiency and simplicity, marking an advancement over traditional IRMS methods that require lengthy onshore processing and headspace equilibration. Using the CO<sub>2</sub> extraction device, our method enables immediate seawater analysis post-collection. The system's automated functionality based on a 12-valve pump supports loading up to 6 samples at one time and unattended operation for over 3 h. We are also evaluating an enhanced system featuring a 24-valve pump, which allows the operator to load up to 18 samples each time and unattended operation for more than 12 h. This improvement further reduces the workload, making it feasible for a single operator to perform DIC/ $\delta^{13}$ C-DIC analysis during typical 12-h sea shifts.

During the first leg of the ECOA 2022, we employed a single analytical system (Unit #1),

later doubling our capacity by introducing Unit #2 for the second leg. Across 40 days, Unit #1

processed 1220 samples, while Unit #2 analyzed 446 during the latter half. This efficiency contrasts with historical data collection rates; over three decades, only 6820  $\delta^{13}$ C-DIC results have been gathered from 32 Atlantic Ocean cruises, averaging 213  $\delta^{13}$ C-DIC values per cruise (Becker et al. 2016). More recently, the 2010 GO-SHIP A13.5 cruise collected merely 634  $\delta^{13}$ C-DIC data compared to 3009 DIC data. By utilizing two analyzers capable of processing 30 samples daily each, we could nearly match the sample density of DIC concentration measurements during a 50-day GO-SHIP cruise, allowing for comprehensive onboard analysis. This approach was validated during the 2023 A16N expedition, where nearly 3000 samples were analyzed directly onboard by two Cai Laboratory members from the University of Delaware, underscoring the significant advancements in our analytical capacity. The deployment of the CRDS-based analyzer during the ECOA 2022 cruise enabled the collection of a substantial  $\delta^{13}$ C-DIC dataset along North America's eastern ocean margins. This comprehensive dataset, combined with DIC concentration and total alkalinity measurements, offers enhanced capacity in assessing anthropogenic carbon changes through advanced regression and back-calculation methods (Friis et al. 2005; Körtzinger et al. 2003). Additionally, it allows for detailed evaluations of DIC and  $\delta^{13}$ C-DIC variations against conservative mixing models in coastal areas, shedding light on the impact of various biogeochemical processes and carbon sources on the DIC pool (Burt et al. 2016; Deng et al. 2022; Su et al. 2020). Moreover, diverse and intricate coastal regions are critical interfaces for carbon flux and transformation between terrestrial ecosystems and the open ocean, making high-spatialresolution  $\delta^{13}$ C-DIC datasets critically needed for resolving unanswered key geochemical and environmental questions. For example, in a recent coupled physical and biogeochemical model study, Kwon et al. (2021) suggested that lateral transport of <sup>13</sup>C depleted organic and inorganic

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carbon from land (river and groundwater) to the ocean was markedly underestimated in the current global carbon cycle and flux models. According to their model simulations, without this territorial export, the deep ocean  $\delta^{13}$ C-DIC value would be 0.2-0.3 % higher. A key geochemical nature that allows this mechanism to work lies in the fact that while most of the proposed enhanced carbon export can be returned to the atmosphere as  $CO_2$  in the coastal zone in a timescale of about one year, the  $^{13}$ C-DIC is exported to the open ocean as the air-sea change of  $^{13}$ C-CO<sub>2</sub> has a much longer timescale of nearly a decade. High-quality and high-spatial-resolution  $\delta^{13}$ C-DIC datasets in ocean margins, such as those we collected along the North American ocean margins during ECOA 2022, provide essential information for validating and improving these important model predictions. As more  $\delta^{13}$ C-DIC data becomes available in coastal and open oceans as a result of the availability of our high throughput and seagoing analytical method, our understanding of the terrestrial-to-oceanic carbon flux and the dynamics of anthropogenic  $CO_2$  accumulation in the ocean will be improved rapidly in future studies.

## **Supporting Information**

Additional information regarding the calculation of the mixing ratio between  $^{13}$ C labeled and ordinary NaHCO<sub>3</sub> for the in-house standard with  $\delta^{13}$ C-DIC > 0 ‰ (Appendix S1), the calculation of the combined relative standard uncertainty for the DIC concentration (Appendix S2) and the combined standard uncertainty for the  $\delta^{13}$ C-DIC measurements (Appendix S3), the comprehensive timeline of the entire analytical process (Table S1), and an example of a daily analysis cycle (Table S2).

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