

# Boundary exchange completes the marine Pb cycle jigsaw

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Material fluxes at the land-ocean interface impact seawater composition and global cycling of elements. However, most attention has been focused on the fluvial dissolved fluxes. For elements like lead (Pb), whose fluvial particulate flux into the ocean is two orders of magnitude higher than the dissolved counterpart, the role of particulates in elemental cycling is potentially important but currently less appreciated. Using both chemical analyses on samples collected from around equatorial Southeast Asia and model simulations, we show that particulate-dissolved exchange is an important mechanism controlling the concentration and isotopic composition of dissolved Pb in the ocean. Our model indicates that Pb contributed from particulate-dissolved exchange at ocean boundaries is larger than, or at least comparable to, other major Pb sources to the seawater before the Anthropocene, when the anthropogenic Pb was absent. Our work highlights the importance of boundary exchange in understanding marine element cycling and weathering-climate feedback.

marine elemental cycling | isotope | Southeast Asia | boundary exchange | Pb

The transfer of materials from land to ocean impacts the chemical composition of seawater and the cycling of elements in the coupled ocean–atmosphere–lithosphere system (1, 2). When assessing marine elemental cycling, the land–ocean material exchange has traditionally been considered mainly through dissolution of terrestrial-sourced aerosols (3) and the fluvial transport of dissolved elements, together with other oceanic sources such as hydrothermal emanations and deep-sea sediments that release some elements in dissolved form (4). Contributions from fluvial particles remain poorly investigated for most of the elements (1). However, as revealed by increasing evidence (5–7), fluvial particles may hold the key to understanding the missing pieces in the "jigsaw" of elemental cycling in the global ocean.

Lead (Pb) is an element of interest in this issue because the global land-to-ocean particulate flux of Pb is several hundred times higher than the dissolved flux (2, 8, 9). As such, the contribution of Pb from fluvial particulates is potentially an important part of the natural cycling of Pb. The global sink of Pb in the oceans involves transfer of dissolved Pb to the deep ocean sediment, which is estimated as  $6.3 \times 10^7$  mol/y based on the sediments across the Atlantic and Pacific (10). The major known natural sources of marine Pb include dissolution of aeolian dust  $[-7.70 \times 10^6 \text{ mol/y} (11, 12)]$ ; volcanic aerosols  $[-6.76 \times 10^6 \text{ mol/y (11)}];$  as well as hydrothermal activity  $[-1.95 \times 10^7 \text{ mol/y (13, 14)}].$ Collectively, these sources constitute only a fraction of the marine Pb sink, leaving an enormous imbalance of  $-2.9 \times 10^7$  mol/y, a large portion of which could potentially be derived from fluvial sources. The total fluvial dissolved Pb flux today ( $-1.16 \times 10^7$  mol/y) (15), which is overprinted with likely a large contribution of anthropogenic Pb (16), is too low to balance the natural Pb cycling in the ocean. Removing the anthropogenic contribution would render an even smaller natural fluvial dissolved flux to this imbalance. Missing in the calculation of marine lead budget is the contribution of Pb derived from fluvial particulates entering the marine environment from land masses, followed by release into the dissolved form. The current imbalance suggests this contribution could be substantial, on the order of at least  $\sim 1.74 \times 10^7$  mol/y, and differing for contemporary versus

historical times before anthropogenic Pb was prevalent. Multiple lines of evidence [e.g., radioactive <sup>210</sup>Pb (17–19), budget estimations (2, 8, 9), direct measurements (20)] suggest that the transport of fluvial particulate Pb is about two orders of magnitude larger than the dissolved counterpart; therefore, the dissolution of even a small fraction of particulate Pb into seawater could greatly impact marine Pb cycling (cf. 10). Exchanges at ocean-land boundaries have been shown to be important mechanisms in the cycling of several elements including neodymium, strontium, and silica (1, 21, 22). Similarly, the exchange of Pb between dissolved and particulate phases has been revealed in several recent studies around the world, including the western Philippine Sea (23), Celtic Sea (24), and Eastern Atlantic margin (25). Additionally, a closed-system experiment using water from the Johor River estuary (equatorial Southeast Asia)

## Significance

Exchange of chemical species and matter at ocean boundaries influences the composition of seawater and is an important process affecting biogeochemical element cycling involving interactions between the atmosphere, hydrosphere, geosphere, and biosphere. However, systematic quantification on the processes and budgets remains scarce. Here, through field, laboratory analysis and modeling, we show that the adsorption-desorption exchange of lead (Pb) between the particulate and dissolved pools at ocean boundaries accounts for about 30 to 40% of Pb input into the ocean before the Anthropocene, which finally resolves the paradox of imbalanced natural sources and sinks of Pb in the ocean. With Pb as an example, our study adds a crucial piece of evidence to the importance of boundary exchange in marine element cycling.

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The authors declare no competing interest.

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directly showed fast and reversible particulate-dissolved exchange of Pb (26). While these studies indicate that exchanges of Pb between dissolved and particulate phases occur at ocean boundaries, the underlying mechanisms and geographical extent remain unexplored. Also unknown is the contribution of this exchange in the cycling of Pb in the global ocean.

The southern and eastern part of Asia are highly relevant for particulate-dissolved exchanges of elements because this area accounts for about two-thirds of the global fluvial sediment flux into the ocean (27) (Fig. 1*A*). Although rivers in this region are shorter than many continental rivers elsewhere, they have disproportionally high-particulate discharges due to high erosion rates associated with steep topographic relief and climates featuring periods of heavy rainfall (1, 27). In this study, through chemical analysis and model simulations, we trace the dynamics of particulate-dissolved exchange and estimate its contribution to dissolved Pb concentration and isotopic composition in the waters surrounding the Malayan Peninsula in equatorial Southeast Asia. Further, we assess the contribution of particulate-dissolved exchange on the global scale for the present-day and pre-Anthropocene ocean.

#### Results

**Geographical Distribution of Seawater Pb Concentration and Pb Isotopes.** From fieldwork, we found that the dissolved Pb concentration in the seawater around the Malayan Peninsula ranged from 24 to 368 pmol/kg (Fig. 2). We treated one unusually high concentration value (1,989 pmol/kg; Johor River Stn 7)



**Fig. 1.** (*A*) Fluvial discharge of sediments to the global ocean replotted from ref. 27. Numbers are mean annual suspended sediment discharges (million tons/ year). Colour shades represent the illustrative catchment regions with major rivers highlighted. (*B*) The seawater sampling stations in this study (yellow circles) and seawater stations in the literature are shown for comparison [red circles, green rectangle, blue triangle (26, 28, 29)]. The rivers relevant to the sampling sites are highlighted in blue. The surface ocean currents are marked with arrows. (*C*) Sampling stations in the Johor River estuary with salinity values (pss) marked next to the station locations; the estuary is highlighted with a square in panel *B*.

as an outlier that probably resulted from particulate leakage during filtration, as its isotope composition is consistent with other samples (Fig. 3). Stations with elevated Pb concentrations (>100 pmol/kg) are generally located near major cities (Fig. 2*A*), which have a high prevalence of Pb sources associated with anthropogenic activities. In contrast, Pb isotopes in the dissolved pool of seawater displayed a different geographical distribution: Waters with high <sup>206</sup>Pb/<sup>207</sup>Pb ratios were generally found near river mouths (Fig. 2*B*), irrespective of inputs from upstream or downstream cities. The difference between the distributions of Pb concentration and isotopic composition indicates separate or nonuniform controls on the two variables.

**Source Apportionment of Seawater Pb Isotopes.** The linear relationship between Pb isotope ratios of seawater in the triple isotope space signifies the existence of two primary endmembers (Fig. 3*A*), one being regional aerosols. Present-day Southeast Asian/Indian aerosols' isotope signatures range from 1.12 to 1.15 for  $^{206}$ Pb/ $^{207}$ Pb (31–33), overlapping with the Pb signature in the

seawater of the southern South China Sea and Eastern Indian Ocean (28, 29). The Pb isotopic composition of regional aerosols also overlaps with two seawaters in our study sampled from the most oceanic sites (Ranong, Thailand, flushed by Andaman Sea water), lending evidence that aerosol Pb is an endmember for seawater (Fig. 3B). The second endmember could be either fluvial-transported anthropogenic Pb or crustal Pb. However, the geographical differences between seawater Pb concentration and Pb isotopic compositions provides evidence against fluvial anthropogenic Pb being an endmember (Fig. 2). Therefore, crustal Pb is likely the other endmember. The isotopic compositions of crustal Pb and regional aerosol Pb bracket almost all the seawater samples examined (Fig. 3A). A crustal Pb endmember also reasonably explains the geographical distribution of Pb isotopes, as enrichment of crustal Pb with high <sup>206</sup>Pb/<sup>207</sup>Pb values is expected at river mouths where fluvial export to the ocean is the highest.

We also found that estuarine Pb isotope ratios vs salinity do not follow a conservative mixing line (Fig. 3C), showing higher



Fig. 2. Geographical distribution of (A) concentration and (B) isotopes of dissolved Pb in seawater samples around the Malayan Peninsula. Major cities or rivers are also highlighted. Figure plotted through Ocean Data View (30).



**Fig. 3.** Comparisons of Pb isotopes in seawater, salinity and SPM. (A) Triple-isotope plot of the seawater samples in this study in comparison with regional sources from three main references (28, 29, 31). The locations of the sites are the same as Fig. 1. The weighted-average salinity distribution was also indicated. (*B*) Scatter plot of the <sup>206</sup>Pb/<sup>207</sup>Pb in Johor River estuary waters compared with SPM concentrations. Regression statistics are presented. (*C*) Scatter plot of dissolved <sup>206</sup>Pb/<sup>207</sup>Pb ratios from this study (all samples) and identified endmembers against salinity. The calculated Pb isotope ratios based on conservative mixing between two endmembers (Johor River Stn1, salinity = 8 ps; and Malacca Strait Stn 2, salinity = 33 pss) are plotted with a blue curve. The uncertainties for Pb isotope measurements are within the size of each symbol. The orange dot denotes a sample treated as an outlier for Pb concentration probably due to poor filtering, but its isotope ratios may still be usable as the dissolved and particulate pools are in equilibrium.

<sup>206</sup>Pb/<sup>207</sup>Pb ratios at intermediate salinities indicating an exchange of dissolved and particulate Pb (Fig. 3*C*), which has been clearly identified in prior studies investigating the behavior of Pb in estuaries (20, 34). We propose that this exchange could produce higher <sup>206</sup>Pb/<sup>207</sup>Pb values in seawater than those predicted by conservative mixing in the waters surrounding the Malayan Peninsula. This exchange process is supported by both the results from a closed-system Pb isotope exchange experiment (26) and the strong linear relationship between seawater Pb isotope ratios and suspended particulate matter (SPM) concentrations observed in this study (R<sup>2</sup> = 0.91, Fig. 3*B*).

**Modeling Pb Transport from Estuary to the Adjacent Sea.** To explore the particulate-mediated transport of Pb across the salinity gradient, we developed a 1-D model based on the conservative mixing of the dissolved pool with addition of an exchangeable particulate pool (Fig. 4*A* and *SI Appendix, Text SI*). In the model analyses, we employed a commonly applied partition coefficient (K<sub>d</sub>) to quantify the particulate-dissolved exchange. The model reproduced the observed distribution of Pb isotopes in the seawater adequately (brown line; Fig. 4*A*), with R<sup>2</sup> values (between modeled and observed ratios) of 0.67 for <sup>206</sup>Pb/<sup>207</sup>Pb, 0.62 for <sup>208</sup>Pb/<sup>206</sup>Pb, and 0.63 for <sup>206</sup>Pb/<sup>204</sup>Pb. However, the model fails to reproduce all the variability of Pb concentrations across the range of observed salinities (Fig. 4*B*). This inconsistency can be explained by additions of various proportions of anthropogenic Pb to the dissolved pool (Fig. 4), which is supported by the different geographical distributions of the Pb concentration and Pb isotopic composition around the Malayan Peninsula (Fig. 2*A*).

To test the effect on Pb isotopes when anthropogenic Pb is added as a source, we ran the K<sub>d</sub> model with random additions of dissolved Pb having regional aerosol isotopic signatures (Fig. 4 and SI Appendix, Text S1). The simulation results show that in coastal waters (salinity > ~30 pss), even if the anthropogenic Pb contribution is enhanced, the re-equilibrated Pb isotopes will move parallel to the modeled curve with minimal deviation (Fig. 4). Further, when more anthropogenic Pb is added in the estuary (salinity ~20 pss), the resultant Pb isotope ratios in the model move in the opposite direction from the observation (Fig. 4), indicating that the observed scatter in Pb at mid-salinity sites may be caused by estuarine dynamics that are not captured by our parameterized model (34), or by addition of dissolved Pb with isotopic compositions dissimilar from aerosols, resulting in a small deviation (~0.01 for <sup>206</sup>Pb/<sup>207</sup>Pb) between observation and model. We conclude that particulate-dissolved exchange could overall reasonably explain the observed Pb isotopes around the Malayan Peninsula, and enrichment of anthropogenic Pb likely explains the various concentrations observed in the coastal areas of high salinity (Fig. 4).

Lastly, we compare the  $K_d$  model with a previous Pb reconstruction using corals from Singapore (*SI Appendix*, Fig. S1 and *Text S2*) (35). Corals directly precipitate their skeletons from seawater, and therefore, the Pb isotope in coral skeletons reflects the seawater dissolved pool (36). The model does not reproduce the observed interannual variability (model-coral deviation around 0.01 to 0.02 for <sup>206</sup>Pb/<sup>207</sup>Pb), likely because our



**Fig. 4.** Observation and modelling of (A) <sup>206</sup>Pb/<sup>207</sup>Pb ratios and (B) concentrations of dissolved Pb compared with salinity. The locations of the sample sites are the same as Fig. 1. The conservative mixing model (blue line), the mixing plus particulate-dissolved exchange model (brown line), and the sensitivity test with random anthropogenic Pb additions (with Pb isotopic composition similar to regional aerosol) are also indicated in green squares. Uncertainties for Pb isotope measurements are within the size of the symbols.

parameterization is based on the large-scale salinity gradient and under-represents urbanized coastal areas (*SI Appendix, Text S2*). However, the K<sub>d</sub> model largely explains the difference of Pb isotopes between the coral record and regional aerosols sources of Pb (coral-aerosol deviation ~0.06, aerosol ~1.12 to 1.15, coral ~1.18 to 1.20 for <sup>206</sup>Pb/<sup>207</sup>Pb, *SI Appendix*, Fig. S1), further supporting the case of substantial particulate-dissolved exchange in coastal waters.

### Discussion

Although our field study does not cover a large expanse of the global coastal ocean, our findings are consistent with studies conducted worldwide. Exchange between dissolved and particulate

pools has been reported for several continental margins where sedimentary Pb inputs with crustal-like isotopic compositions were observed, including the western Philippine Sea (23), the Celtic Sea (24), and the Eastern Atlantic margin (25). In the northern Indian Ocean, the seawater <sup>206</sup>Pb/<sup>207</sup>Pb signature from the Bay of Bengal was 0.005 to 0.010 higher than that from the Arabian Sea, while the Pb concentrations of the two regions were almost identical (28). The isotopic difference is not likely explained by differences in anthropogenic sources, as the offset is observed throughout the water column, whereas the anthropogenic Pb in the northern Indian Ocean is largely confined to the upper waters (28). Therefore, the most likely explanation is that sediments derived from rivers, including the Ganges-Brahmaputra, Irrawaddy, and Salween River and numerous smaller rivers draining to the sea, modify the isotopic composition of dissolved Pb in the Bay of Bengal to align more with that of crustal sources (28).

Given the scattered evidence on particulate-dissolved exchange around the world, the importance of this process for the marine Pb cycling prompted us to investigate how much this process contributes to seawater chemistry in both the present-day and pre-Anthropocene oceans. Using the K<sub>d</sub> model with a step increase in seawater Pb concentration from 0 to 100 pmol/kg, our simulations suggest that particles scavenge Pb when the dissolved pool exceeds ~25 pmol/kg. Conversely, particles release Pb to the dissolved pool at lower seawater Pb concentrations (SI Appendix, Fig. S2A). Here we stress that 25 pmol/kg is our specific model result, not a universal threshold. However, this simulation result lends credence to the supposition that the seawater dissolved Pb concentration, in part, modulates the net particulate-dissolved exchange flux of Pb to the ocean dynamically. Given the expected large variability of dissolved Pb concentrations in coastal seas, our model result is consistent with observations of the non-uniform behavior of Pb in estuaries around the world, including net removal from dissolved phases by particles (18, 34, 37), as well as both quasi-conservative transport with salinity gradient (18, 38, 39) and reversible (two-way) exchange between dissolved and particulate phases (34, 38).

Further, the Pb in the present-day ocean is overprinted by a large anthropogenic input (40), resulting in high Pb concentrations in the coastal waters (e.g., refs. 41 and 42). Therefore, in today's ocean, fluvial particles are usually net sinks of Pb, with isotope exchange occurring between the dissolved and particulate pools (Fig. 5). Observations from outside the Amazon River mouth (with salinities 32 to 35 pss) are consistent with this hypothesis. The <sup>206</sup>Pb/<sup>207</sup>Pb in the tropical Atlantic waters influenced by Amazon river plume are approximately 1.17 to 1.18, suggesting a significant contribution of crustal origin (43). The Pb concentrations in these waters (~15 to 18 pmol/kg) were lower than other places in the Western tropical Atlantic (~20 to 24 pmol/kg). The lowered Pb concentration associated with reworked isotopic composition in the Amazon-influenced seawater agree well with what our model predicts for particulate-dissolved exchange.

Conversely, we would expect lower dissolved Pb concentrations in seawater prior to the Anthropocene, whereby desorption from terrestrial particles was likely a more important source of Pb to seawater. The average Pb concentration in the pre-Anthropocene ocean has been estimated at ~2 pmol/kg (12), and the Pb concentration in the coastal water can be several folds higher: e.g., estimated to be about 10 pmol/kg from coral records in Bermuda (36) and Sumatra (29). If an average 6 pmol/kg of Pb is assumed, we estimate the fluvial particle exchange flux in the pre-Anthropocene ocean was on the order of ~ $2.93 \times 10^7$  mol/y (range  $2.31 \times 10^7$  to  $3.56 \times 10^7$  mol/y, based on the Pb concentration in seawater of



**Fig. 5.** Conceptual illustration of the estimate Pb flux from natural sources in the pre-Anthropocene ocean. In addition to fluvial particulates (this study), estimates of other natural sources include wind-borne dust particles (12), volcanic aerosols (11), hydrothermal systems (13, 14), and fluvial dissolved inputs (15), are also illustrated. The two *Inset* figures on the right illustrate the expected behavior and observation of particulate-dissolved Pb exchange in the present-day and pre-Anthropocene ocean.

2 to 10 pmol/kg; *SI Appendix*, Fig. S2*B*), which is about 30 to 40% of the global Pb flux to the ocean (Fig. 5 and *SI Appendix*, Fig. S2*B*). This estimated flux assumes similar geophysical conditions as those in the present day [e.g., weathering intensity, rainfall-runoff regime, fluvial SPM flux (44)].

To test the sensitivity of this estimated flux, we varied the particulate exchangeable pool (±50%), which is a significant amplitude, given relatively stable global weathering fluxes on different geological time scales (45-47). This variation resulted in an estimated flux range of  $1.51 \times 10^7$  to  $4.40 \times 10^7$  mol/y. The lower bound of this simulated fluvial particulate-dissolved exchange flux is comparable with other major Pb sources to the ocean (Fig. 5 and SI Appendix, Fig. S2B), suggesting that crustal particles discharged at continental margins are a major source of Pb to the pre-Anthropocene ocean. Our estimation compares well with the budget proposed by Chow and Patterson (10) that estimated a significant pre-anthropogenic fluvial Pb source entering the ocean (Fig. 5). Our study builds on this seminal work by identifying a plausible mechanism through which terrestrially derived materials influence the distribution of Pb in the ocean beyond fluvial plumes. Improved understanding of this mechanism involving particulate-dissolved Pb exchange should also aid in interpreting climate-modulated weathering signals in sedimentary records (e.g., ref. 48).

The influence of particulate-dissolved Pb exchange is also traceable in the pre-Anthropocene deep ocean, as revealed by a compilation of seawater Pb isotope reconstructions based on ferromanganese crusts and authigenic sediment coatings (*SI Appendix*, Fig. S3). Boundary exchange in the western North Atlantic, which has been shown to be a major factor determining deep ocean Neodymium isotopic composition (49), also likely influences Pb isotopic composition in this region. In particular, incongruent weathering plays an important role in releasing more radiogenic Pb isotopes from ice sheet-denuded materials along the continental margin (50) (*SI Appendix*, Fig. S3). North Atlantic Deep Water (NADW) carries the radiogenic isotope signal southward, with only some fraction reaching the Southern Ocean because of the relatively short residence time of Pb in the ocean [a couple of hundred years (51)]. Imprinted on some terrestrial-derived detritus sourced from the East Antarctica, the radiogenic Pb signature of NADW can still be seen in the Indian Ocean sector of the Southern Ocean due to the transport of Circumpolar Deep Water (52, 53) (*SI Appendix*, Fig. S3). Another deep ocean region with potentially significant boundary Pb exchange is the northeastern Indian Ocean, where more radiogenic Pb is registered than in other Indian Ocean domains (53, 54) (*SI Appendix*, Fig. S3). The most parsimonious explanation for the isotope anomaly in this region is the exchange of Pb isotopes between seawater and the terrestrial sediments discharged from the Trans-Himalayan complex to the Bengal Fan, which is also consistent with seawater results discussed above (28).

Finally, in addition to providing evidence of the importance of boundary exchange in marine Pb cycling, our study provides reference points for investigating the boundary exchange of other elements. The importance of terrestrial particulate materials in marine element cycles has received increasing attention, but so far systematic studies have been mainly focused on a few elements (1). Considering that river discharge of particulate matter dominates the total flux of most elements to the global ocean (8), future studies on the exchange between particulate and dissolved phases are vital for understanding the processes driving element and isotope distributions in modern oceans (e.g., refs. 55 and 56), as well as weathering and climate feedback in the past revealed by proxy records (e.g., refs. 47 and 57).

#### Materials and Methods

**Site and Sampling.** Four cruises were conducted around the Malayan Peninsula (equatorial Southeast Asia) between 2016 and 2017 (*SI Appendix*, Table S1), including those focused on the Andaman coast near Ranong (Thailand), the Malacca Strait (Malaysia, Singapore), the Eastern Malaya Peninsula Coast (Malaysia), and the Johor River estuary (Malaysia). The Malacca Strait is a shallow (average depth ~27 m) channel in the tropical Southeast Asia, connecting the southern South China Sea and the Eastern Indian Ocean (Fig. 1). The current in Malacca Straits reverses seasonally in response to the monsoon–overall northwestward in northern hemisphere winter and southeastward in summer (58). Terrestrial material enters the strait from numerous rivers on the Malayan Peninsula and Sumatra Island, both of which are on the Eurasian Plate (59) (Fig. 1*B*). The Pb isotopic composition of the crustal particulates shows <sup>206</sup>Pb/<sup>207</sup>Pb

ratios >1.2 and <sup>206</sup>Pb/<sup>204</sup>Pb ratios of about 19, which correspond with both ore minerals and natural sediments (60–62). The crustal Pb isotope offsets from the regional aerosols with <sup>206</sup>Pb/<sup>207</sup>Pb ~1.15 (31, 32, 63), the latter are believed to be the main source of Pb to the ocean (64).

We sampled seawater at 34 locations by lowering a polycarbonate pole into the water upstream of the boat. Sampling depth was within 1 m of the surface. A trace-metal-clean bottle was attached with the pole to collect the water sample. Upon collection, the seawater samples were filtered through a trace metal clean filter (0.4 µm pore size, Whatman Nuclepore<sup>TM</sup>) within 24 h following trace metal protocols (65). Ancillary parameters including salinity and the concentration of SPM were measured during most cruises. The salinity was measured by a conductivity-temperature-depth (CTD) sensor on board (Seabird) or a refractometer when the CTD is not available. The accuracy of salinity was 0.01 pss for CTD and ~0.2 pss for refractometer. The SPM was measured by filtering 1 L of seawater through a pre-weighed GF/F filter and then frozen to -20 °C on board. In the laboratory, the filters were oven-dried at 75 °C for 24 h then mass determinations were made on a microbalance (66). Detailed information about the dates of the cruises and availability of ancillary data can be found in *Sl Appendix*, Table S1.

Analytical Method on Seawater Pb Concentration and Isotopes. The preparation and analytical method for the determination of seawater Pb concentration and isotopes closely followed GEOTRACES protocols (65). The Pb concentration was measured using isotope dilution after single batch nitrilotriacetate (NTA) resin extraction (67). Briefly, each 1 mL of seawater sample was spiked with a <sup>204</sup>Pb-enriched solution of known concentration (Oak Ridge National Laboratory), an ammonium acetate buffer (pH = 5.3), and NTA resin beads (approximately 2,400 beads, cleaned) for Pb uptake. After 4 d of uptake, the beads were rinsed several times and eluted of Pb in 0.1 M of high-purity nitric acid (Optima grade, Thermo Fisher) for analysis on an Inductive Coupled Plasma Mass Spectrometer (ICP-MS) at Center for Environmental Sensing and Modeling (CENSAM), Singapore-MIT(Massachusetts Institute of Technology) Alliance on Research and Technology. The precision of the measurements was determined by independently preparing and running each sample in at least triplicates; and the concentration was accepted when at least two out of three replicates agreed. The accuracy of the measurements was determined by running the GEOTRACES SAFe D1 seawater, for which we determined a Pb concentration of  $26.4 \pm 1.4$  pmol/kg (n = 4) which is not significantly different from the consensus value of  $27.7 \pm 2.6 \text{ pmol/kg} (41, 68)$ .

The Pb isotope composition of the seawater was measured using a multicollector ICP-MS housed in the environmental geochemistry laboratory, Nanyang Technological University of Singapore, after an extraction of Pb through magnesium hydroxide ( $Mg(OH)_2$ ) co-precipitation and purification through hydrochloric-bromic acid (HCI-HBr) ion exchange chromatography (69). Briefly, 100 mL aliquots of seawater were added into two trace-metal-clean centrifuge tubes. A minimal amount of vapor-distilled ammonia solution was added to the seawater to trigger  $Mg(OH)_2$  precipitation that scavenged the Pb from the sample. The precipitate was redissolved in Optima grade HCI (Thermo Fisher), and the liquids

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from the two centrifuge tubes were combined and precipitated again to further concentrate the Pb into a smaller amount of  $Mg(OH)_2$ . The overall precipitate was then dissolved in a minimal amount of 1.1 M Optima grade HBr (Thermofisher). then loaded into Eichrom AG-1X8 anion exchange resin (chloride form, 200 to 400 mesh) columns and purified via HCI-HBr chromatography. The column blank was typically less than 7 pg, compared with the 1 to 2 ng of Pb in the seawater sample. The precision and accuracy of the Pb isotope analysis were compared with reference to replicates of standard reference material NBS981, which indicated high measurement quality even at low level of detection (typically 1 to 2 ng of Pb, *SIAppendix*, Table S2). In addition, we conducted an inter-laboratory comparison of the Pb isotope in seawater with Boyle's laboratory at MIT. The inter-laboratory comparison on the same sample shows highly comparable results (*SI Appendix*, Table S2). These comparisons suggest that our Pb isotope measurement should be good to  $\pm 0.001$  (2SD) for <sup>206</sup>Pb/<sup>207</sup>Pb or better.

**Modeling the Particulate-Dissolved Pb Exchange.** Please see the *SI Appendix, Texts S1 and S2* for detailed information on the modeling of regional Pb isotope compositions and global particulate-dissolved Pb exchange fluxes.

# Data, Materials, and Software Availability. All data in this study is included as *SI Appendix*.

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