Supporting Information for "Intensification of tropical Pacific biological productivity due to volcanic eruptions"

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1. Model Description

1.1. MIROC

⁵ The MIROC version 3.2 is based on an atmospheric general circulation model with ⁶ a horizontal spectral truncation T42 (which corresponds to about 2.8° resolution) and ⁷ 20 vertical sigma levels coupled to an ocean general circulation model with a horizontal ⁸ resolution of $1.4^{\circ} \times 0.6^{\circ} - 1.4^{\circ}$ and 44 vertical levels.

The MIROC Last Millennium simulation (LM-MIROC) uses external forcing of total solar irradiance anomalies derived from three different reconstructions [Crowley, 2000; Bard et al., 2000; Lean et al., 1995] (see description in Table S1 and Figure S1b), volcanic radiative forcing that was specified by using latitude-dependent aerosol optical depth (AOD) anomalies, and greenhouse gas concentrations [Crowley, 2000]. The diagnosed radiative forcing (Figure S1a) is obtained by multiplying AOD by -20 as stated in Gao et al. [2008].

¹⁶ To quantify the marine biogeochemical response to simulated ocean anomalies in ¹⁷ MIROC, we additionally use an offline three-dimensional marine biogeochemical model

with a homogenized atmospheric box [Chikamoto et al., 2012]. The box atmosphere in 18 the offline model is only used for calculating the atmospheric carbon dioxide (CO_2) level. 19 The CO_2 level is determined by variations of wind speed, sea surface temperature, sea 20 ice coverage (gas exchange), and sea surface CO_2 concentration (solubility). The bio-21 geochemical model is based on a simplified nutrient-phytoplankton-zooplankton-detritus 22 NPZD) type. Phytoplankton growth depends on the availability of nitrate concentration 23 and insolation. Detail description of biogeochemical processes is shown in Chikamoto 24 et al. [2012]. 25

The offline biogeochemical model uses daily physical data of ocean velocities, short-26 wave insolation, temperature, salinity, and sea-ice distribution interpolated from MIROC's 27 monthly outputs. Since this offline method neglects an effect of high frequency physical 28 variability (on timescale shorter than a month), the simulated marine ecosystem response 29 may be slightly different with the simulation obtained from fully coupled Earth System 30 model. However, this difference would be small, which doesn't affect our conclusion on 31 the basis of annual-mean analysis. In our offline approach we do not allow the prognostic 32 atmospheric CO_2 concentration to influence the atmospheric radiation. 33

The ocean biogeochemical model is spun up for 5000 years using prescribed atmospheric CO₂ of 278 ppmv (corresponding to the level in 850 C.E.) and using monthly physical fields corresponding to the 850 C.E. conditions from the LM-MIROC simulation. After 5000-yr integration, the global-mean dissolved inorganic carbon concentration reaches a steady state, which suggests that the ocean carbon cycle reaches equilibrium. Starting from this steady-state biogeochemical field, we integrate the biogeochemical model with

⁴⁰ fully prognostic atmospheric CO₂ from 850 to 1850 C.E. using monthly climate output ⁴¹ fields from LM-MIROC.

1.2. CESM

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The Community Earth System Model 1.0.1 (CESM; Hurrell et al. [2013]) includes fully-42 coupled components of the atmosphere, ocean, sea ice, and land surface. The atmosphere 43 component (Community Atmosphere Model 4; Neale et al. [2010]) has a finite volume core with a horizontal resolution of $1.25^{\circ} \times 0.9^{\circ}$ and 26 vertical levels. The ocean component 45 is the Parallel Ocean Program version 2 (POP2; Smith et al. [2010]; Danabasoglu et al. 46 [2012]) with a nominal 1° horizontal resolution and 60 levels. The horizontal resolution 47 varies and is higher around the equator for an improved representation of equatorial up-48 welling. Embedded in POP2 is the Biogeochemical Elemental Cycle model (BEC; Moore 49 et al. [2004]). 50

The BEC biogeochemical model includes four nutrients (nitrate, phosphate, silicate, 51 and dissolved iron), three phytoplankton functional groups (small phytoplankton, di-52 atoms, and diazotrophs), one zooplankton group, dissolved inorganic and organic carbon, 53 alkalinity and oxygen [Moore et al., 2004; Moore and Braucher, 2008]. River discharge 54 from Community Land Model version 4.0 (CLM4) does not carry dissolved tracers, but 55 prescribed nitrogen deposition at the ocean surface is using the 1850 C.E. data [Lamarque 56 et al., 2010]. In a preindustrial control run in CESM 1.0.3 version, small phytoplankton 57 growth at the tropical Pacific region is determined by the availability of iron, nitrate, 58 insolation, and temperature, while that of diatom is additionally affected by silicate con-59

centrations [Chikamoto et al., 2015]. The detail biogeochemical process in the model is described in Moore et al. [2004]; Moore and Braucher [2008].

The last millennium simulation LM-CESM is described in detail in Lehner et al. [2015]. 62 We calculated a 258-year-long 850 C.E. control simulation with CCSM4 [Gent et al., 2011]. 63 Using this steady-state field of the 850 C.E. control simulation, we additionally ran a long 64 1850 C.E. control simulation. The applied transient forcing largely follows the protocols 65 of PMIP3 [Schmidt et al., 2011]. In particular, we used the variations in AOD due to the 66 volcanic forcing [Gao et al., 2008] (Figure S1a), land use changes [Pongratz et al., 2008], 67 and fossil fuel emissions (post 1750 C.E., following Andres et al. [2012]) (Table S1). Total 68 solar insolation is based on Vieira and Solanki [2010], but was scaled the amplitude of 69 change from the Maunder Minimum to present day by 0.2 % [Keller et al., 2015]. Small 70 drifts in deep-ocean carbon and temperature indicate the not-equilibrated nature of the 71 control simulation. However, there are no detectable drifts in the top 150 meters. 72

1.3. LOVECLIM

The intermediate complexity model LOVECLIM is based on the ECBilt atmosphere 73 model with a T21 spectral truncation (corresponding to about 5.6° horizontal resolution) 74 and three vertical levels coupled to the ocean-sea ice model CLIO with $3^{\circ} \times 3^{\circ}$ hori-75 zontal resolution and 20 vertical levels, which is coupled to a thermodynamic-dynamic 76 sea ice model [Goosse et al., 2010]. Allowing for shortwave feedbacks, our version of 77 LOVECLIM adopts a new empirical cloud scheme, which calculates vertically integrated 78 grid-box cloudiness as a function of vertical velocity at 500 hPa, surface temperature, 79 relative humidity, and precipitation [Sriver et al., 2014]. Using annual-mean values of 80

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temperature and precipitation, the vegetation model VECODE computes the evolution of vegetation once a year.

In the three-dimensional global carbon cycle model LOCH, the biogeochemical components are phosphate, silicate, organic matters, and dissolved oxygen [Menviel et al., 2008]. Phytoplankton growth is determined by the availability of phosphate concentration and insolation, and in polar region the growth rate additionally exhibits the temperature dependence. Further description of the biogeochemical model is available in Menviel et al. [2008].

LOVECLIM is integrated for 5000 years with prescribed atmospheric CO₂ of 278 ppmv until reaching a steady-state value, then by prognostic atmospheric CO₂ for 2000 years. We added the forcing of global CO₂ emission after 1751 C.E. due to fossil-fuel burning, cement manufacture and gas flaring from Carbon Dioxide Information Analysis Center (http://cdiac.ornl.gov/ftp/trends/co2_emis/vir.dat).

We conducted a 10-member ensemble simulation starting 0 C.E. with different initial conditions until 2000 C.E.. The spin-up period is for 850 years from 0 to 850 C.E., which is enough to reach steady state of the surface dynamics and biogeochemistry. Then we analyzed 10 members of the last millennium simulation from 850 to 1850 C.E.. The ensemble mean provides a more robust estimation of the forced signal component.

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182	Table S1. External forcing of the last millennium simulations					
	Model	Orbital	Solar irradiance	Trace gasses	Volcanoes	Land Use
	MIROC	PMIP3 ¹	PMIP3	$PMIP3^1$	Gao et al. $[2008]^4$	_
			(CBL^*)			
183	CESM	PMIP3 ¹	$PMIP3^{1}$	$PMIP3^1$	Gao et al. $[2008]^4$	PMIP3
			(Vieira and Solanki [2010])	(1751CE $\sim)$ Andres et al. [2012]		(Pongratz et al. $[2008]^5$)
	LOVECLIM	PMIP3 ¹	PMIP3	(1751CE \sim) CDIAC ⁶	Crowley $[2000]^8$	(1850CE \sim)
			(Muscheler et al. $[2007]^7$)			Houghton $[2003]^9$

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(*) CBL is spliced data set of Crowley $[2000]^1$, Bard et al. $[2000]^2$, Lean et al. $[1995]^3$. Since

the Crowley data cover only after 1000 CE, we fit a spline to the data from the Crowley data to

¹⁸⁷ the Bard data. Then the resulting time series were scaled to the Lead data that cover only 1610

¹⁸⁸ CE onward. The final scaling was performed to become consistent with the solar forcing in the

¹⁸⁹ MIROC's 20th century historical run submitted to CMIP3.

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193 (2) ftp://ftp.ncdc.noaa.gov/pub/data/paleo/climate_forcing/solar_variability/bard_irradiance.txt

194 (3) ftp://ftp.ncdc.noaa.gov/pub/data/paleo/climate_forcing/solar_variability/lean2000_irradiance.txt

- 195 (4) http://climate.envsci.rutgers.edu/IVI2/
- 196 (5) http://cera-www.dkrz.de/WDCC/ui/Compact.jsp?acronym=RECON_LAND_COVER_800-1992
- 197 (6) http://cdiac.esd.ornl.gov/ftp/ndp030/global.1751_2008.ems
- 198 (7) ftp://ftp.ncdc.noaa.gov/pub/data/paleo/climate_forcing/solar_variability/muscheler2007solar-mod.txt
- 199 (8) ftp://ftp.ncdc.noaa.gov/pub/data/paleo/gcmoutput/crowley2000/
- 200 (9) http://cdiac.ornl.gov/trends/landuse/houghton/houghton.html

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¹⁹¹ Data are available at

^{192 (1)} http://www.ncdc.noaa.gov/paleo/pubs/crowley.html



Figure S1. Time series of monthly-mean (a) volcanic forcing of MIROC (blue) [Gao et al., 2008], CESM (green) [Gao et al., 2008], and LOVECLIM (red) [Crowley, 2000], annual-mean (b) solar irradiance forcing, and (c) atmospheric 2m temperature anomaly in the Northern Hemisphere for the 1500 to 1850 reference periods, and the concentration of overlapping NH temperature reconstructions for the 1500 to 1850 reference period (in Figure 5.8 by IPCC AR5 [Masson-Delmotte et al., 2013]) (grey shading).

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Volcanic forcing [-W/m²]

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Figure S2. Scatter plots of volcanic forcing $(-\text{W m}^{-2})$ and the anomaly of global SST (°C) with 0–2 years mean lag from the 1000-year mean in MIROC (blue circles), CESM (green circles) and LOVECLIM ensemble mean (red circles). Black stars show the global-mean SST estimates in another model [Church et al., 2005; Stenchikov et al., 2009] or historical SST analysis studies [Rayner et al., 2003]. Grey lines are standard deviation of 10 ensemble members in LOVECLIM. Blue, green and red lines are the regression between the volcanic forcing and the SST change in each model.

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SST [°C]

-1.5

0

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Figure S3. Scatter plots of the anomalies of global-mean atmospheric 2m temperature (°C) and of the tropical Pacific SST (°C) (5°S–5°N, 120°E–80°W) with lag 0 and 2 years (for the period from -2 to +5 years) after strong volcanic events (< -5 W m⁻²) in MIROC (blue), CESM (green), and LOVECLIM (with all ensemble members, red). In the left figure with lag 0 year (for 8-year analysis), it exhibits 40 cases for 5 volcanic events (= 5 events × 8 years) in MIROC, 88 cases for 11 volcanic events in CESM, and 240 cases for 3 volcanic events in LOVECLIM. In the right figure with lag 2 years (for 6-year analysis), it includes 30 cases in MIROC, 66 cases in CESM, and 180 cases in LOVECLIM.

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