

Climate Modelling and Safe Emission Pathways

Les Gustins Summer School – 08.08.2025

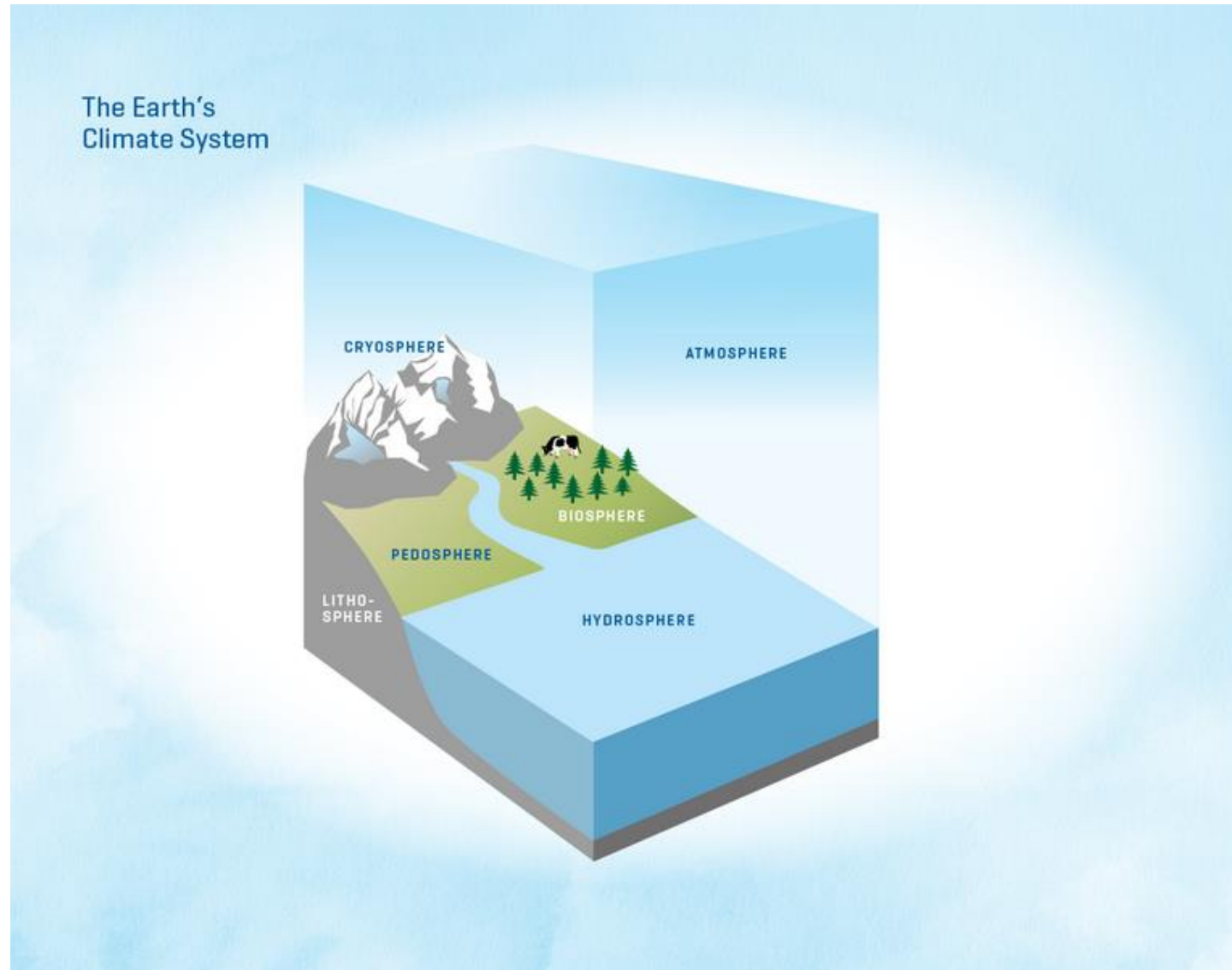
Marine Leyvraz^{1,2}, Jens Terhaar^{1,2}, Thomas Frölicher^{1,2}

¹Climate and Environmental Physics, Physics Institute, University of Bern, Bern, Switzerland

²Oeschger Centre for Climate Change Research, University of Bern, Bern, Switzerland

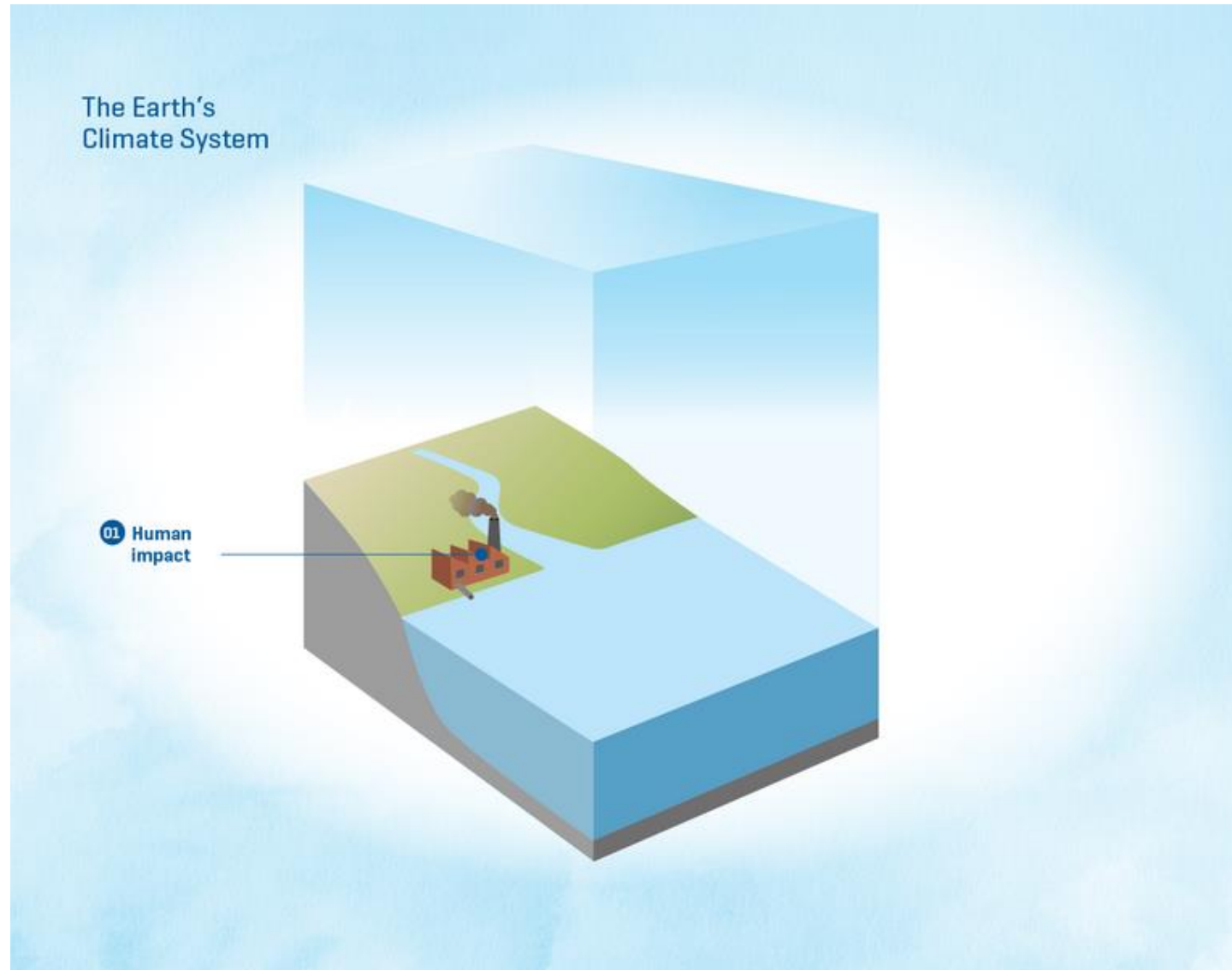
- 1. Climate Modelling**
- 2. Carbon Cycle**
- 3. Safe Emission Pathways**

Earth's Climate System Components



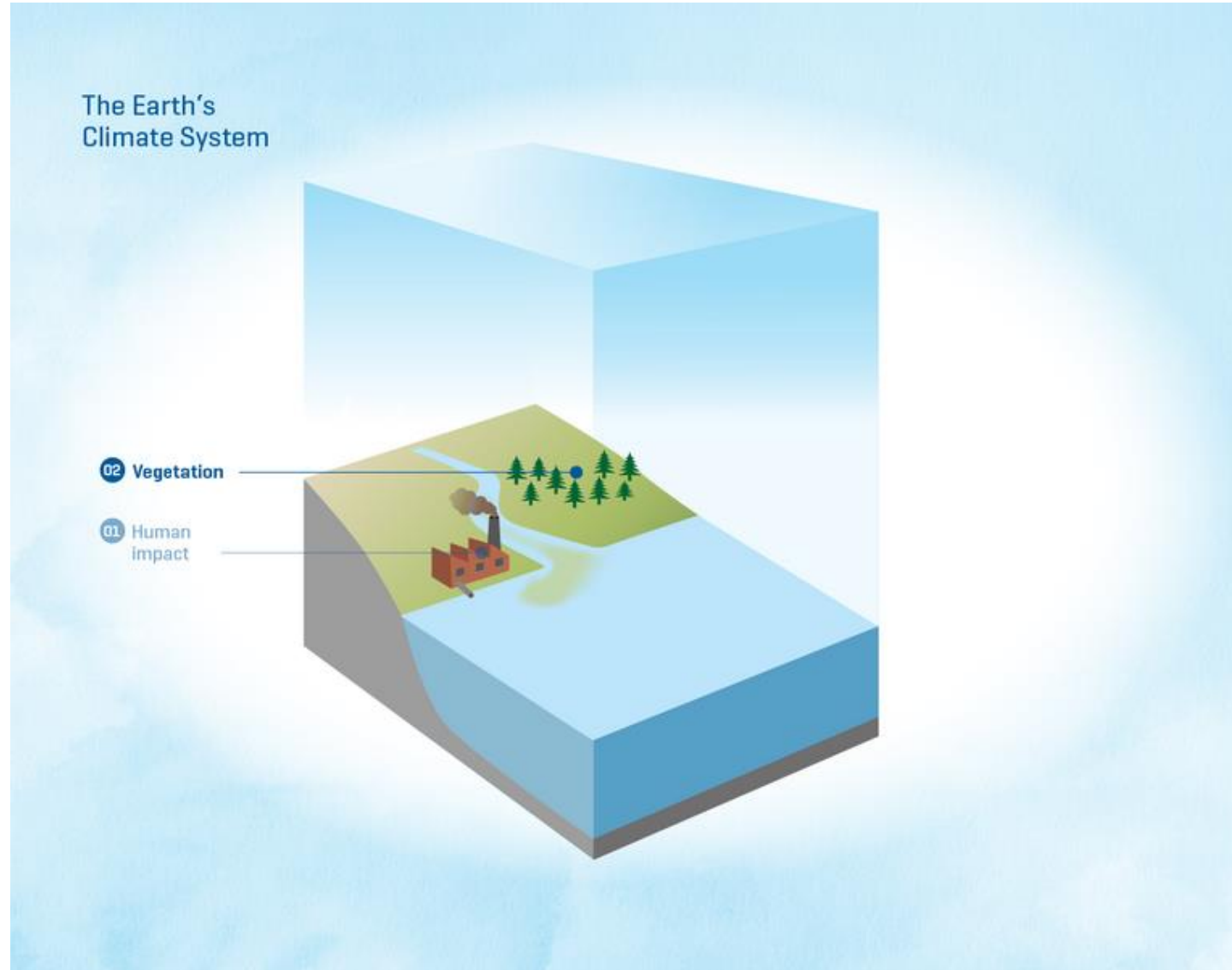
The Earth's Climate System, Geomar

Earth's Climate System Components



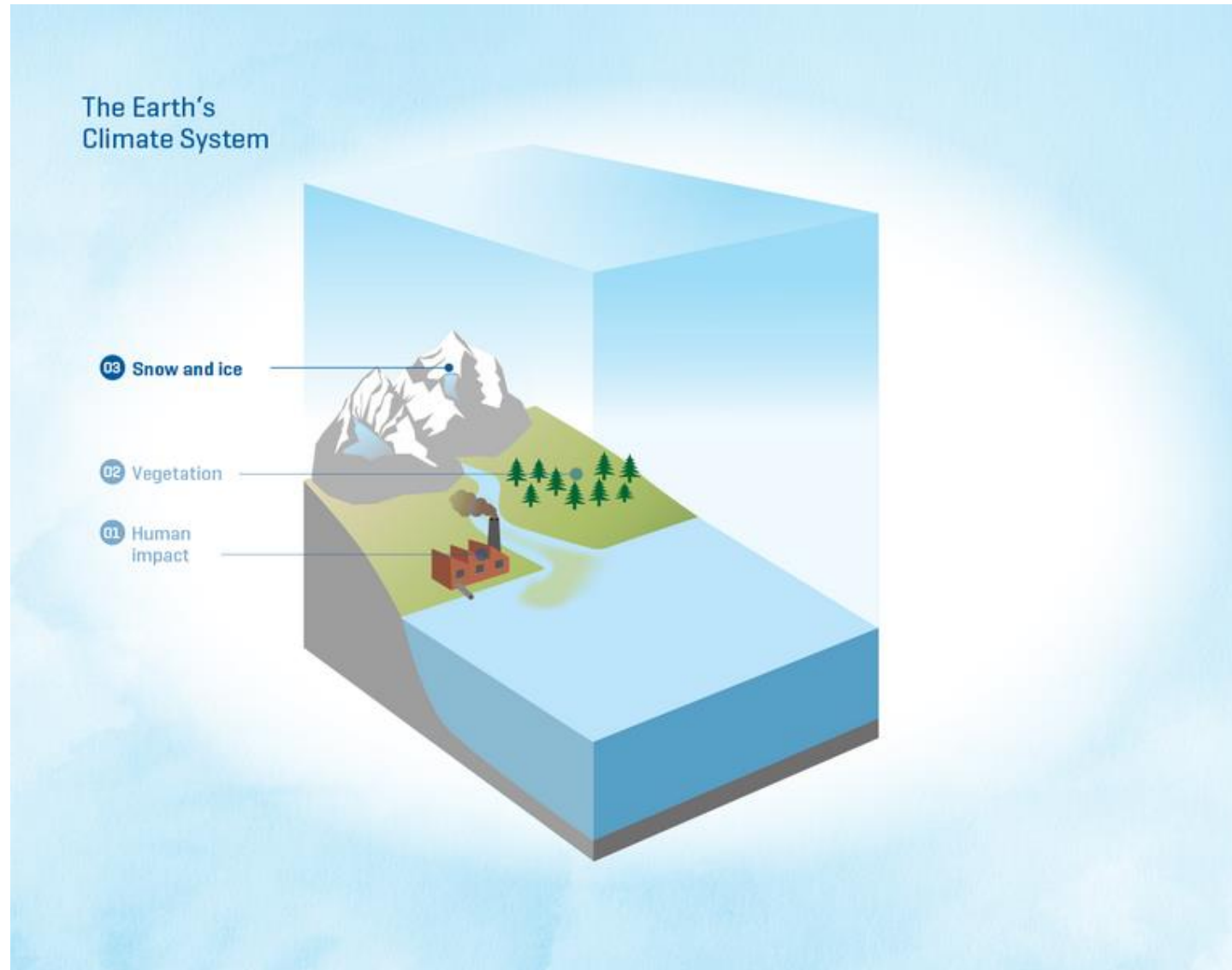
The Earth's Climate System, Geomar

Earth's Climate System Components



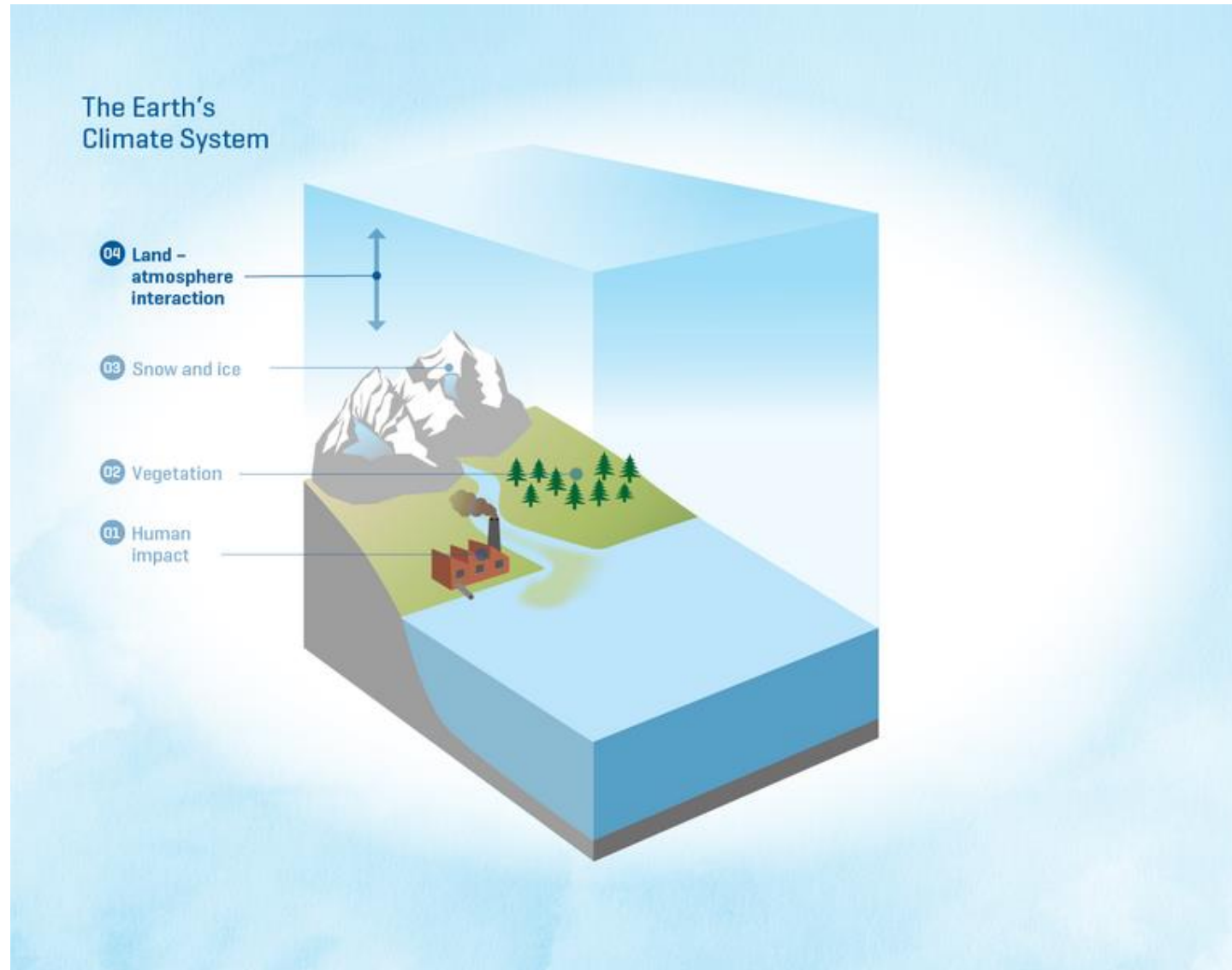
The Earth's Climate System, Geomar

Earth's Climate System Components



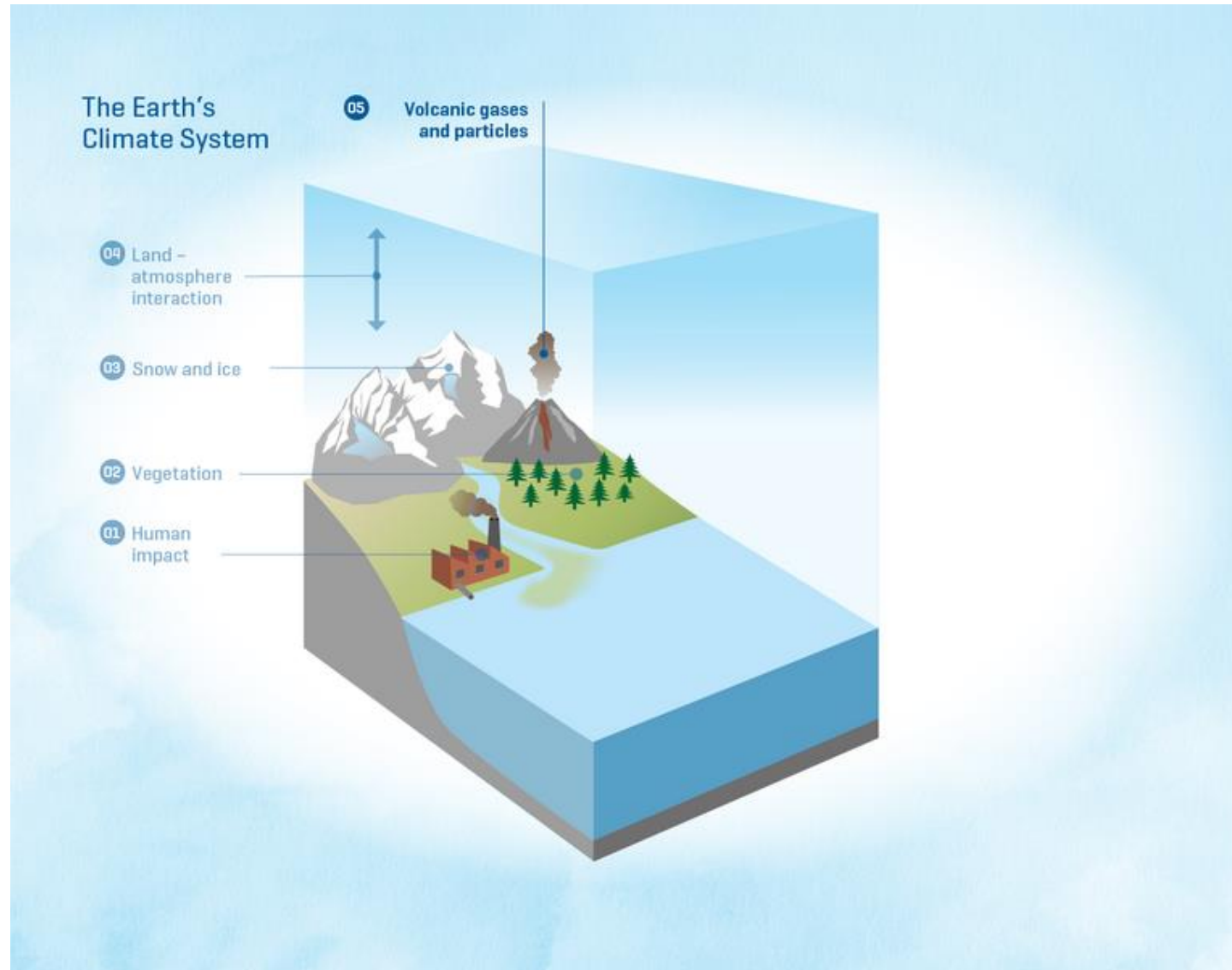
The Earth's Climate System, Geomar

Earth's Climate System Components



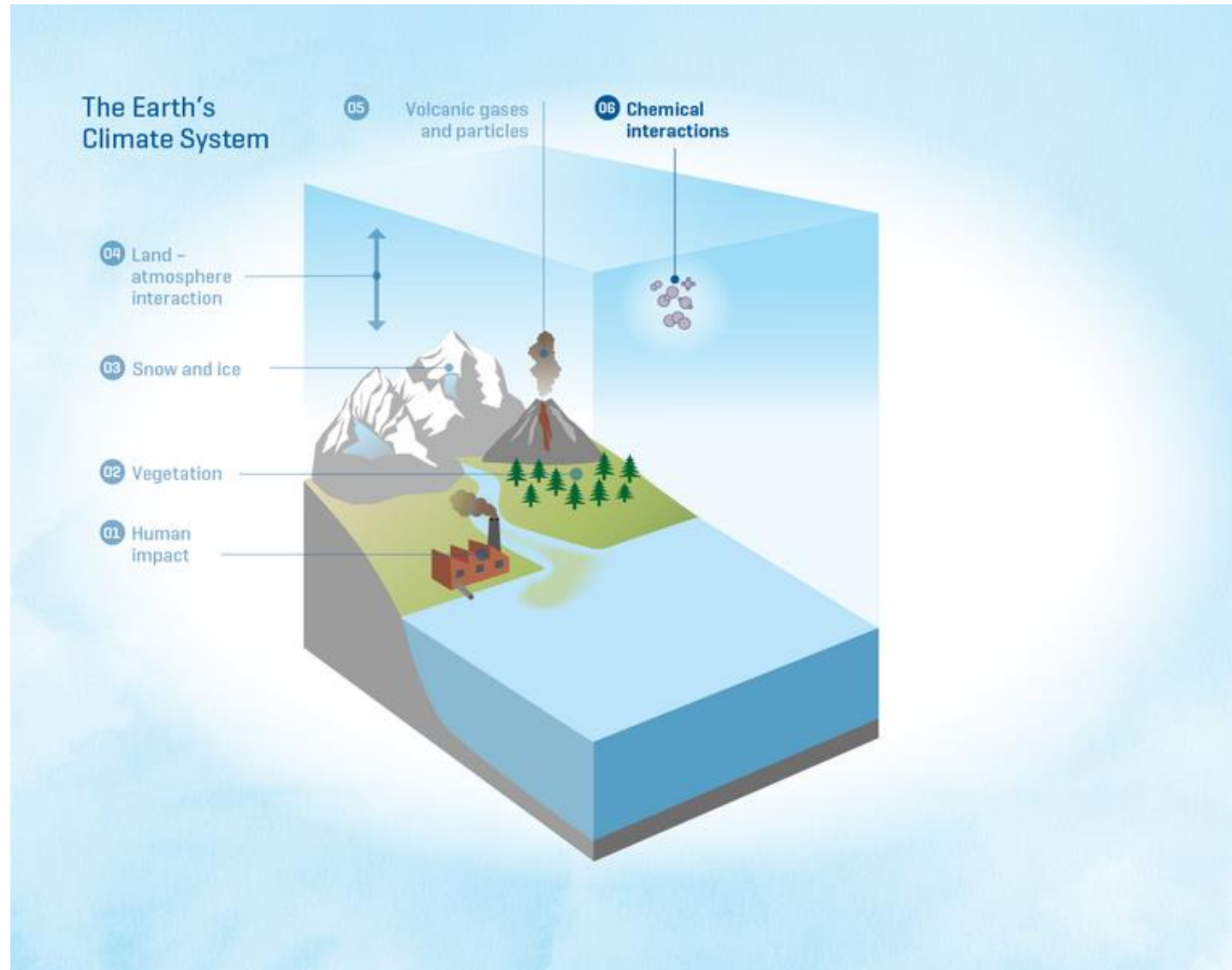
The Earth's Climate System, Geomar

Earth's Climate System Components



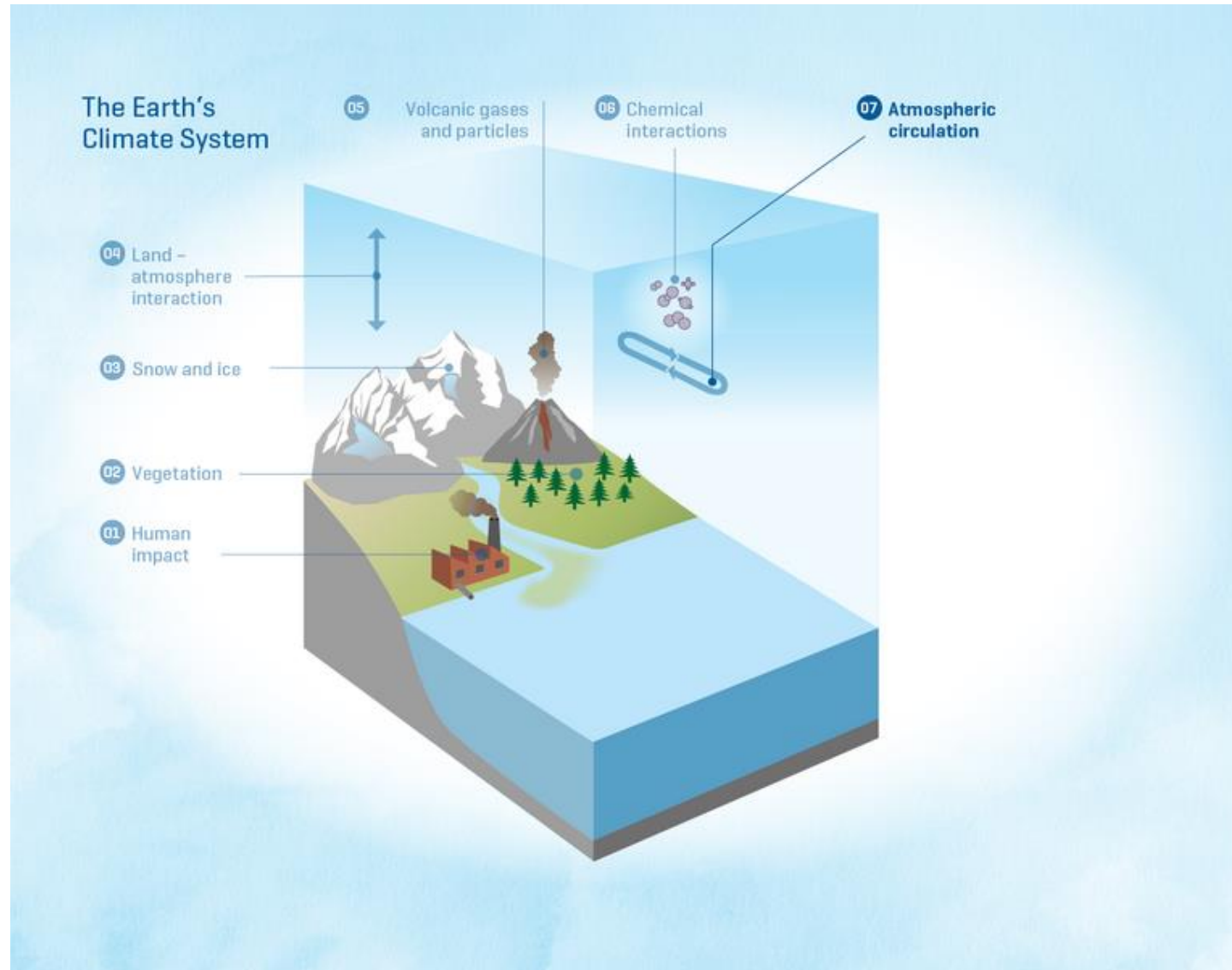
The Earth's Climate System, Geomar

Earth's Climate System Components



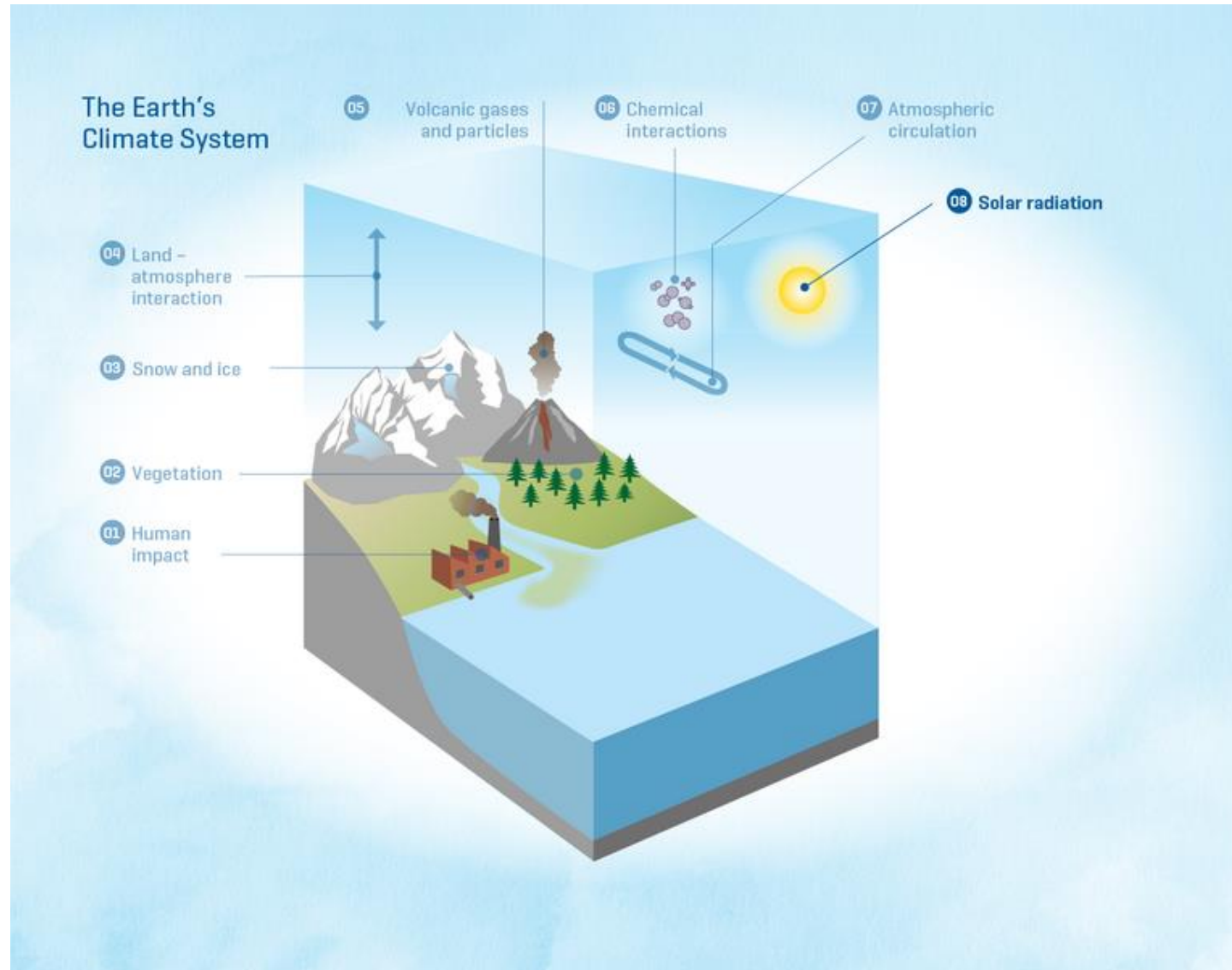
The Earth's Climate System, Geomar

Earth's Climate System Components



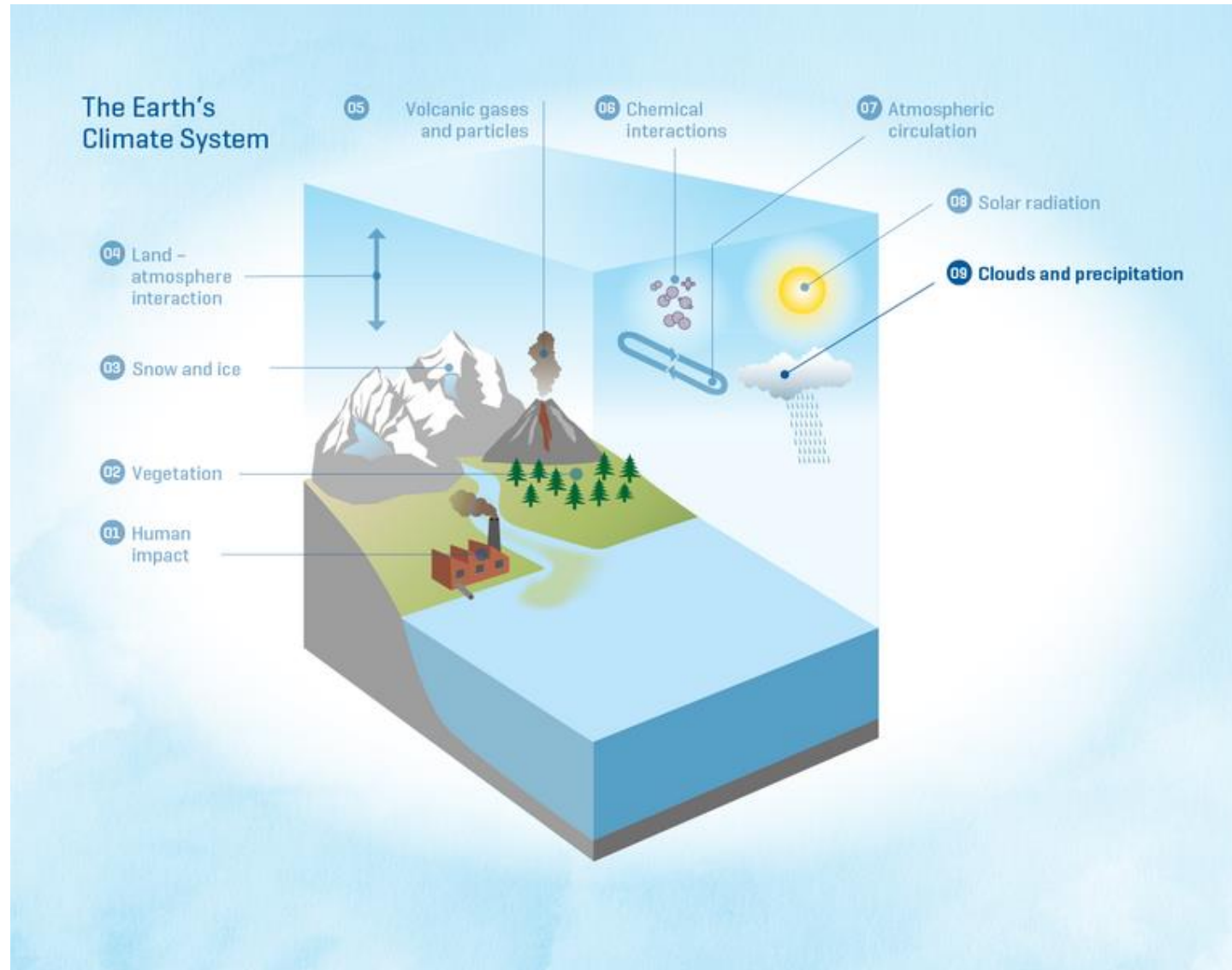
The Earth's Climate System, Geomar

Earth's Climate System Components



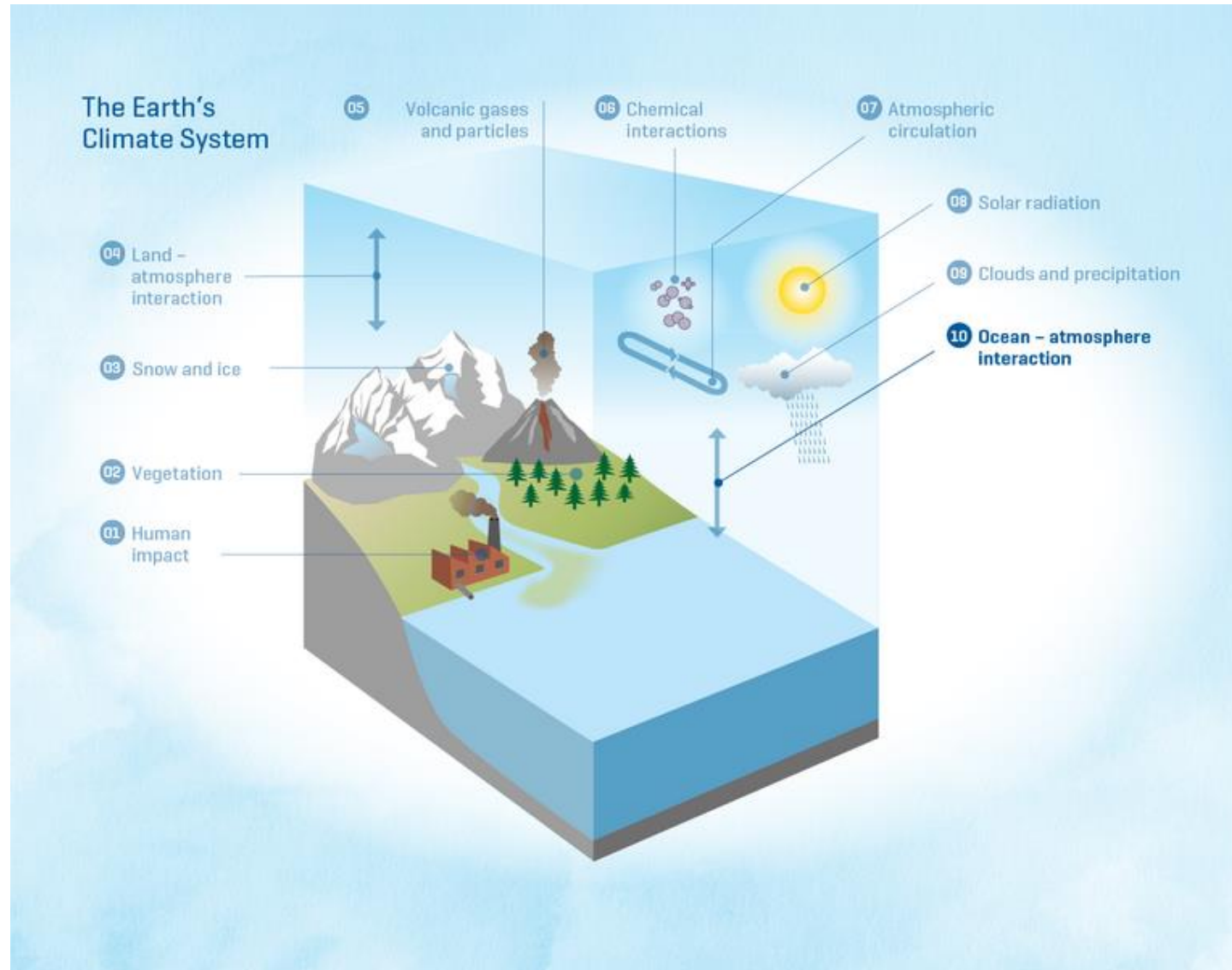
The Earth's Climate System, Geomar

Earth's Climate System Components



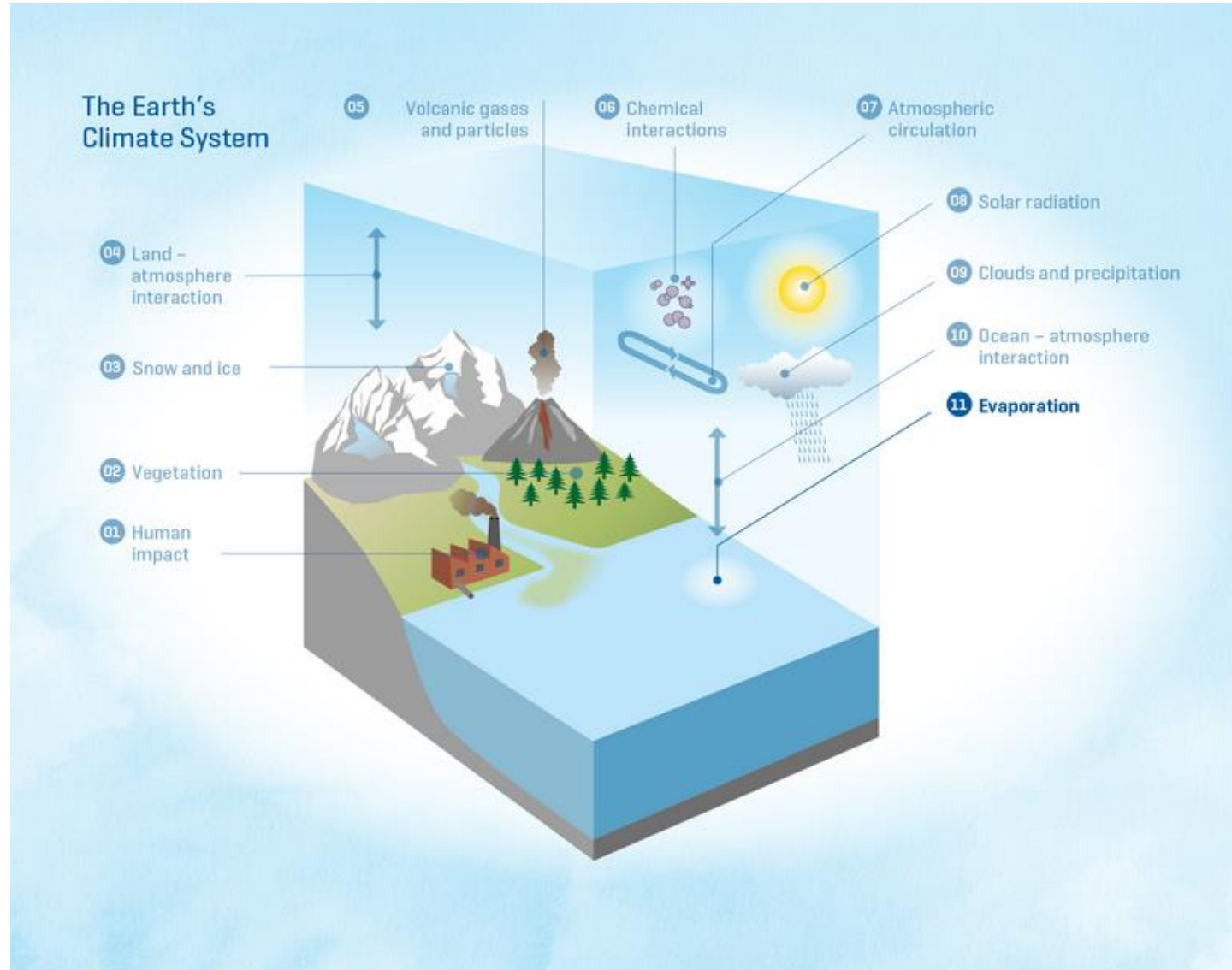
The Earth's Climate System, Geomar

Earth's Climate System Components



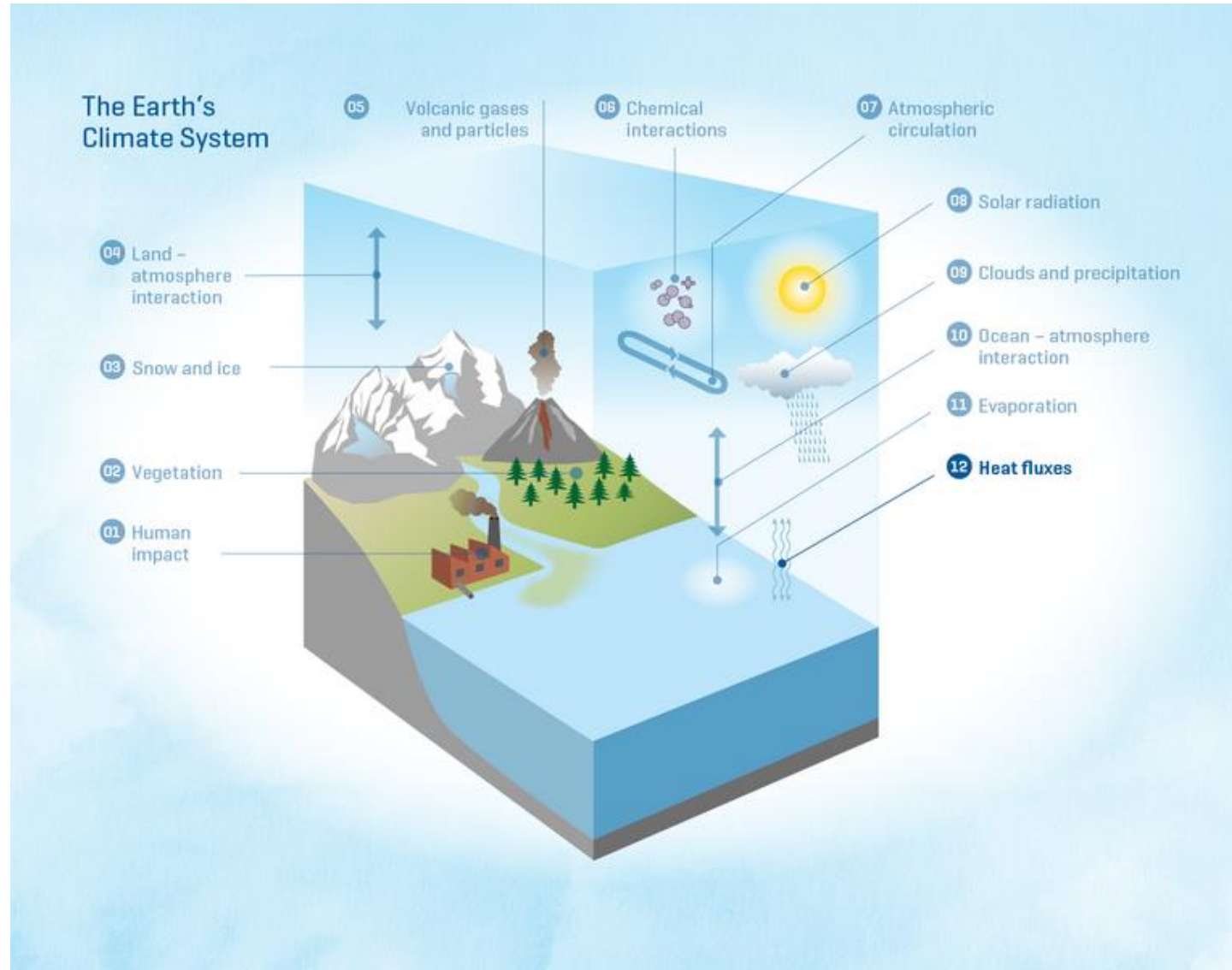
The Earth's Climate System, Geomar

Earth's Climate System Components



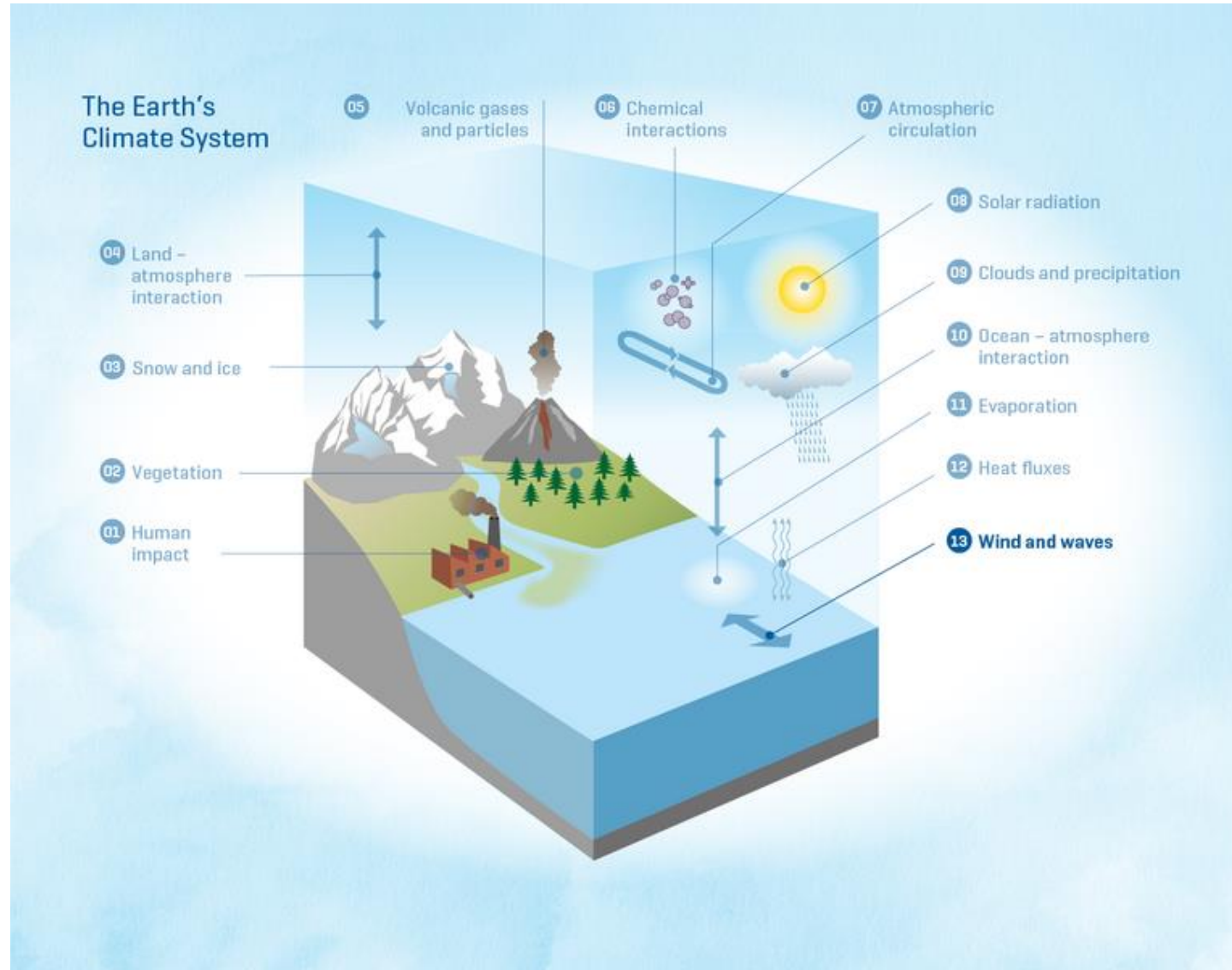
The Earth's Climate System, Geomar

Earth's Climate System Components



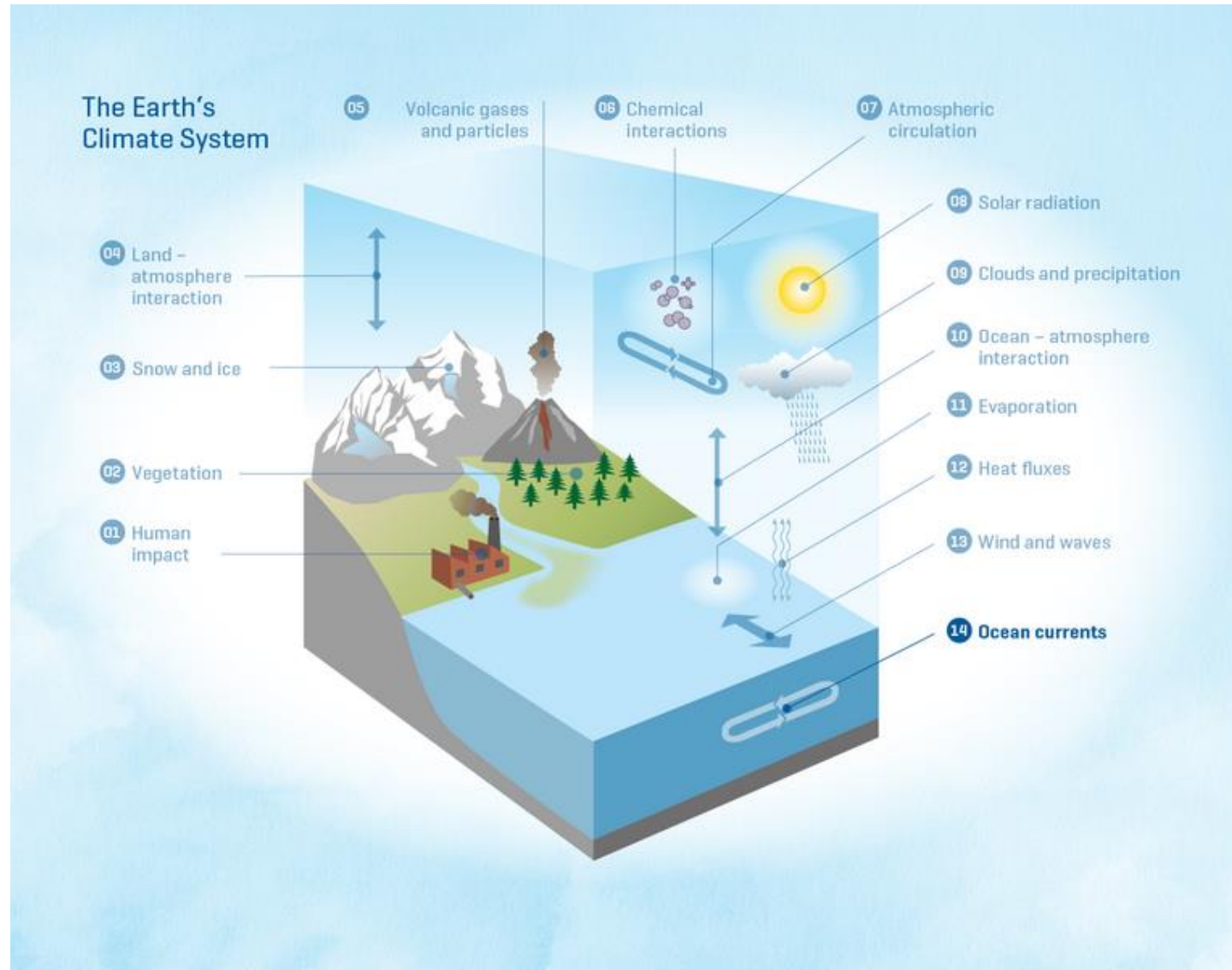
The Earth's Climate System, Geomar

Earth's Climate System Components



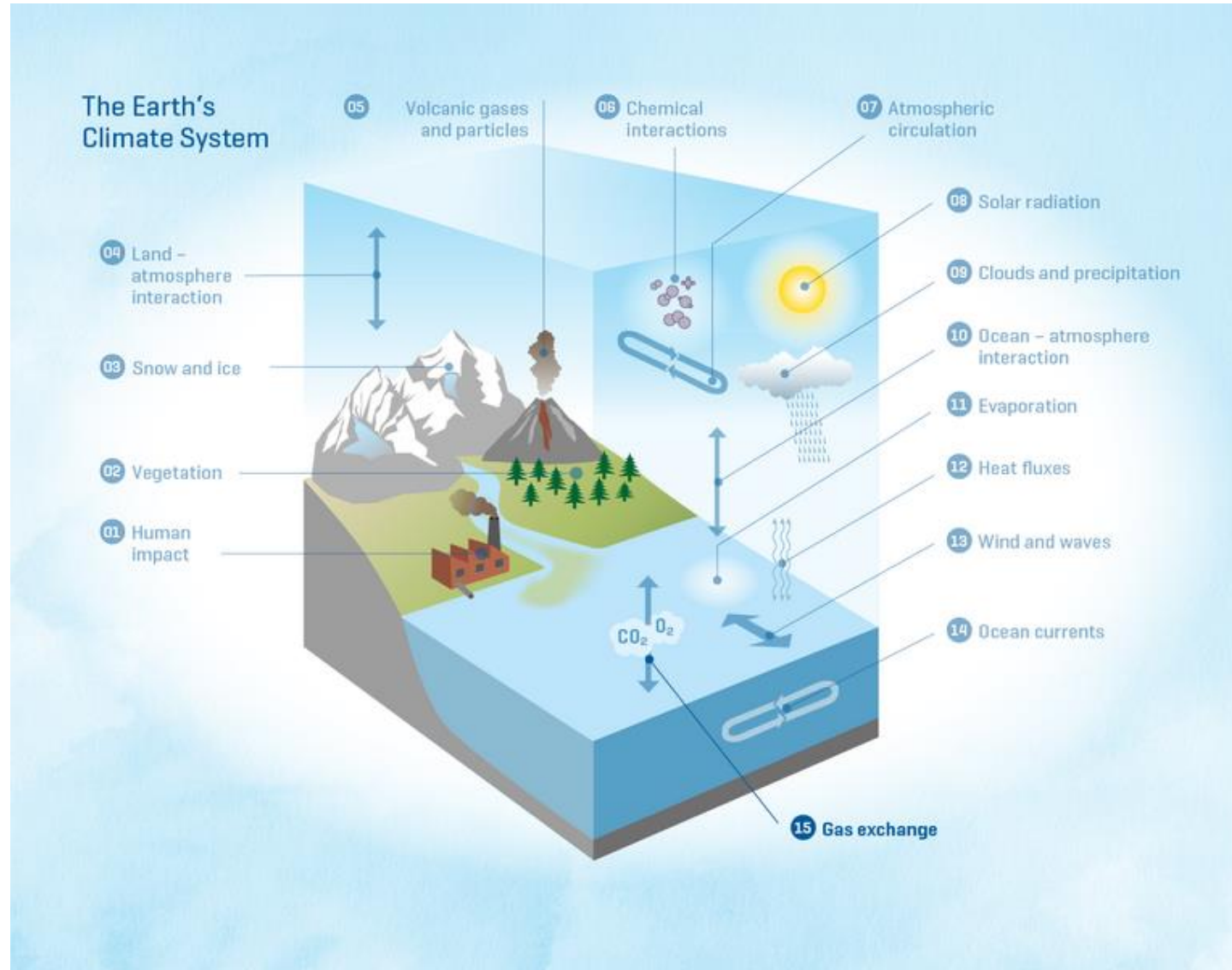
The Earth's Climate System, Geomar

Earth's Climate System Components



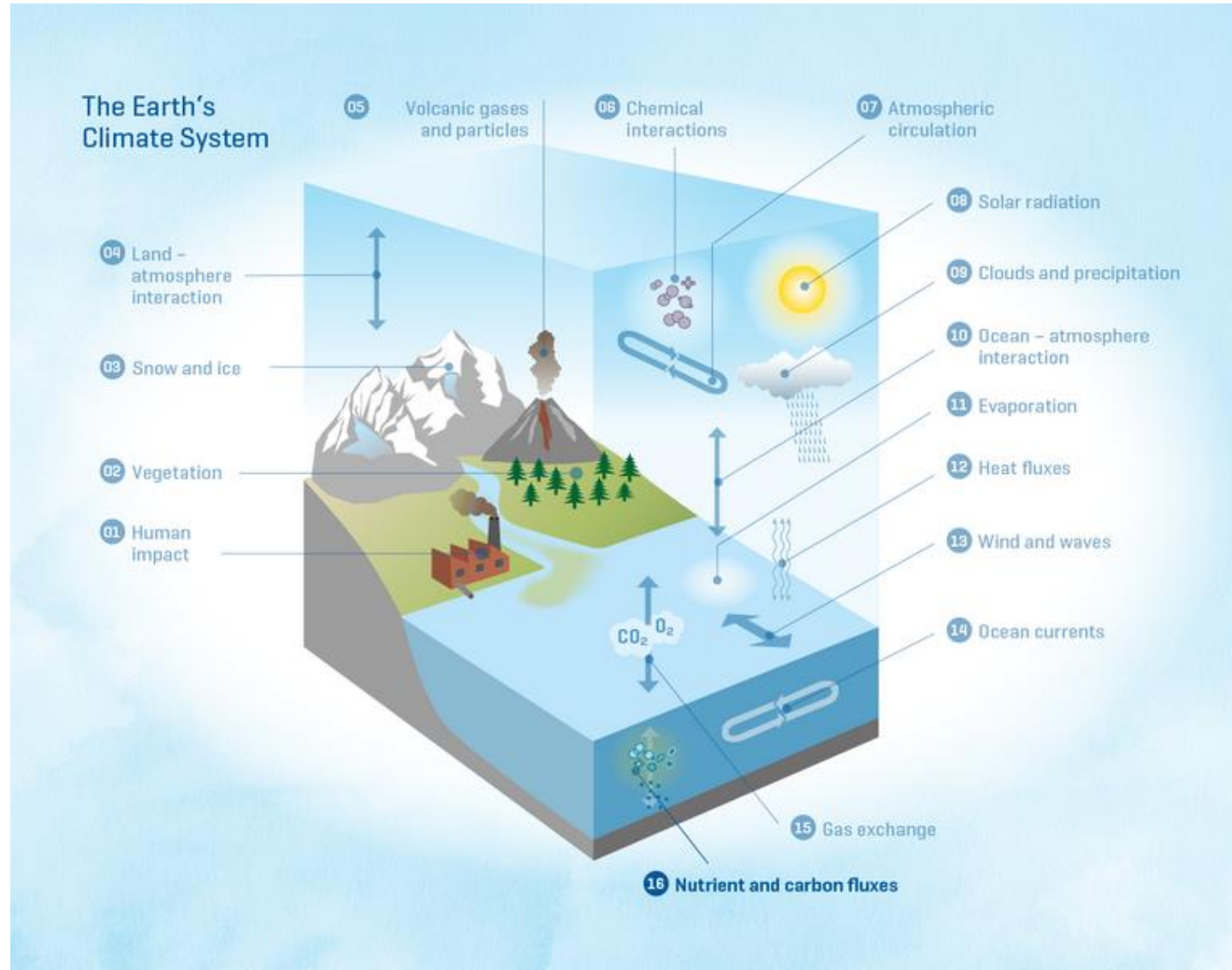
The Earth's Climate System, Geomar

Earth's Climate System Components



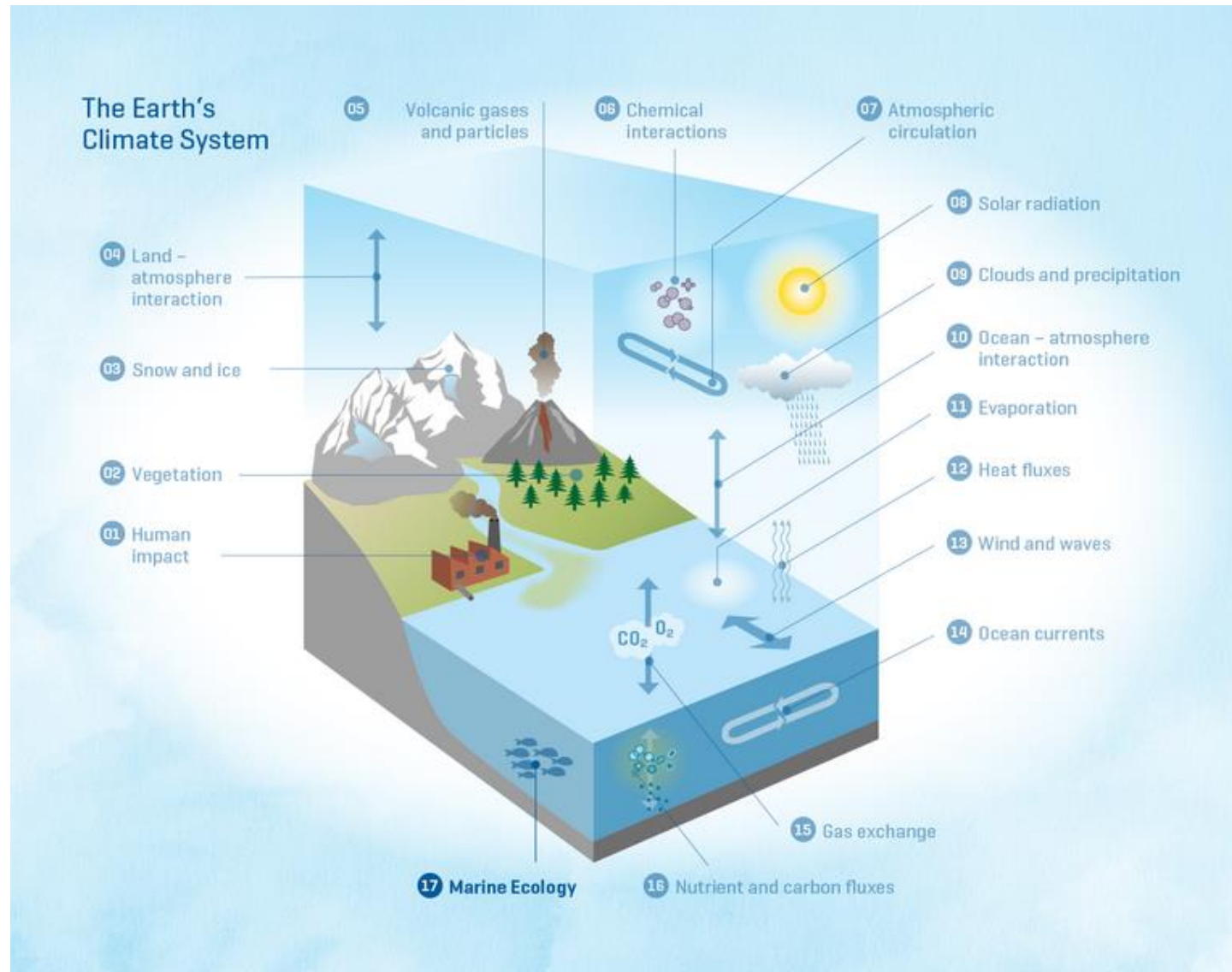
The Earth's Climate System, Geomar

Earth's Climate System Components



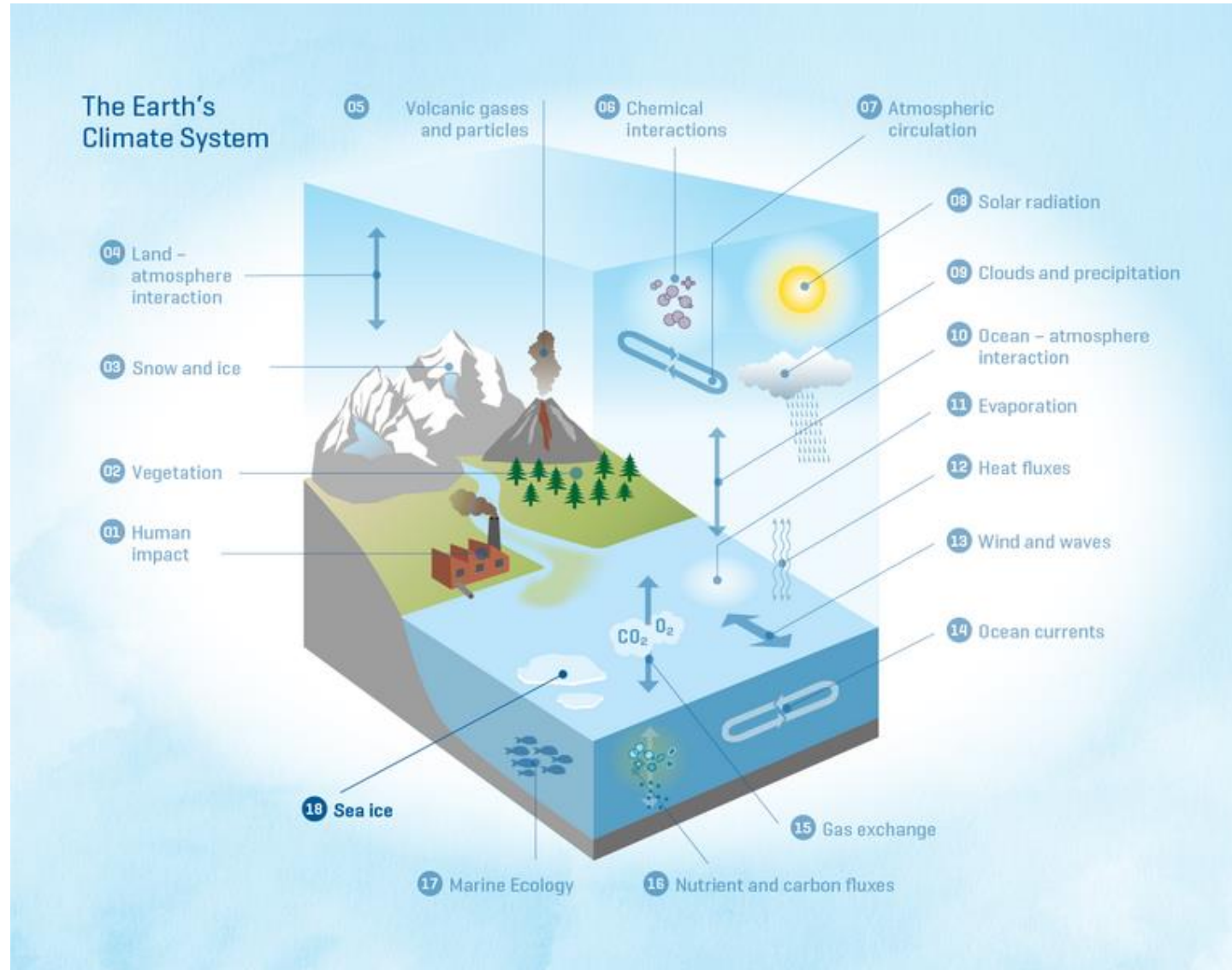
The Earth's Climate System, Geomar

Earth's Climate System Components



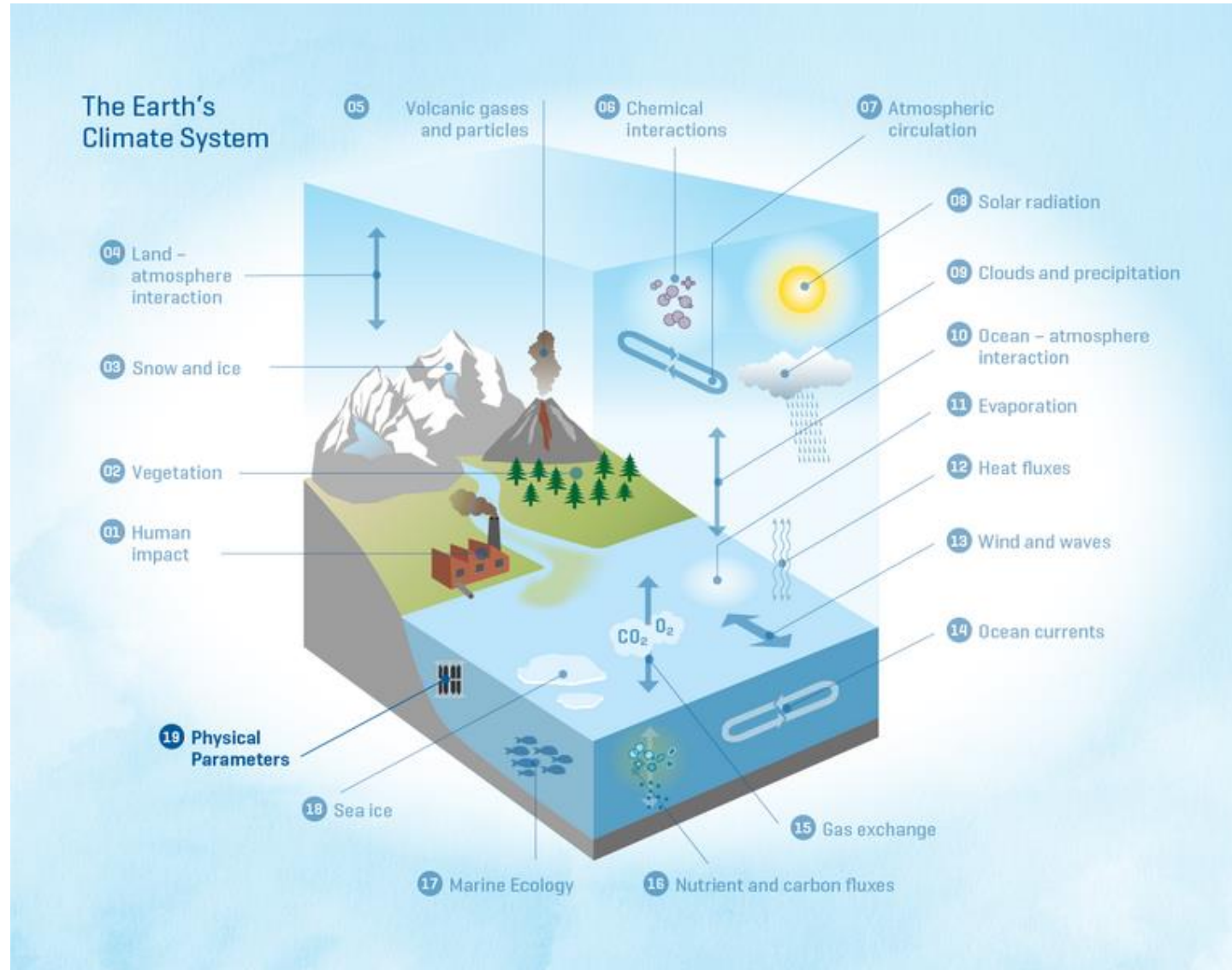
The Earth's Climate System, Geomar

Earth's Climate System Components



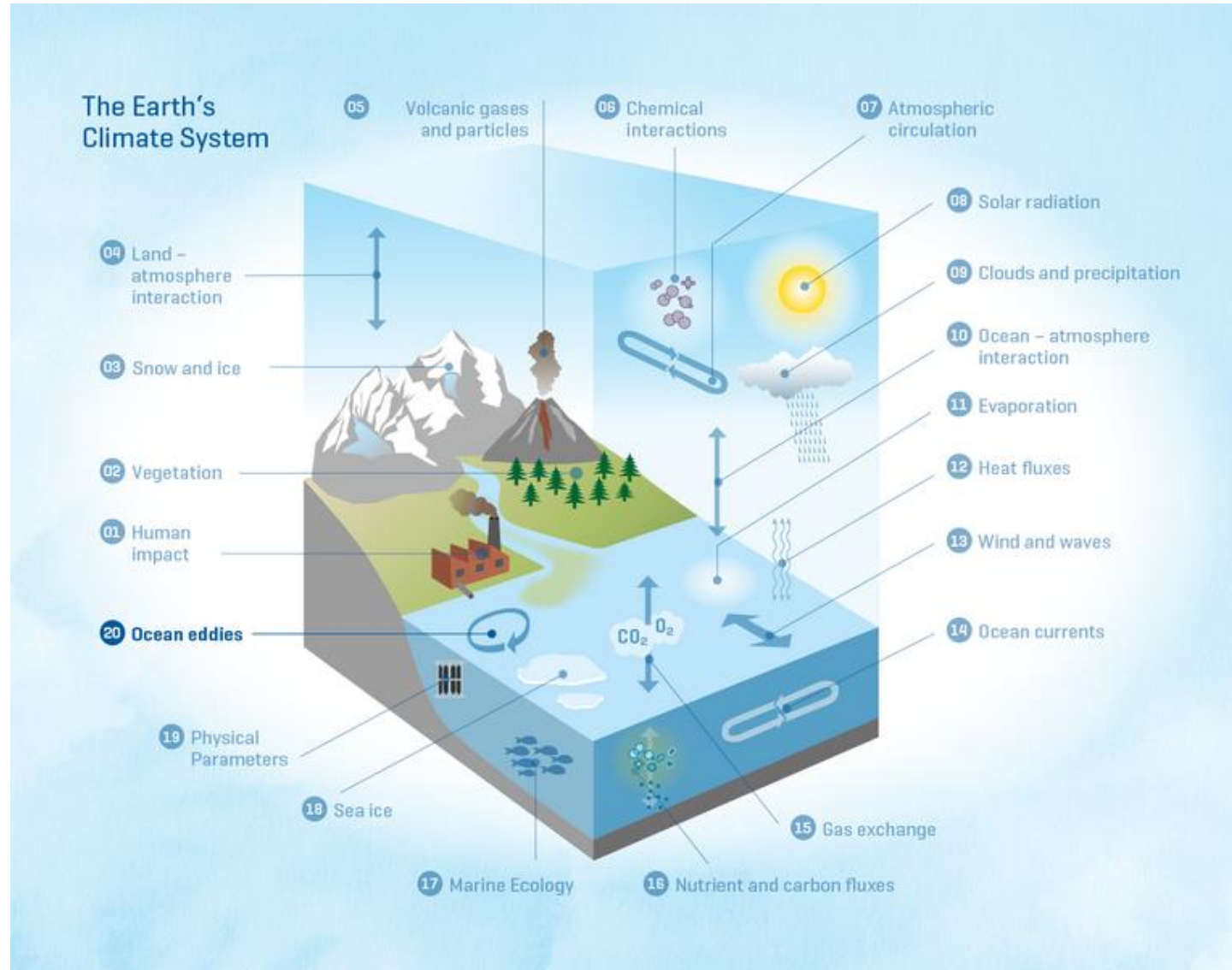
The Earth's Climate System, Geomar

Earth's Climate System Components



The Earth's Climate System, Geomar

Earth's Climate System Components



The Earth's Climate System, Geomar

Climate Models



Climate ≠ weather



Numerical implementation of many **physical processes**



Complex **interactions** between the different climate components



Globe divided into **grid cells** → spatial resolution



Differential equations solved for each **time step** → temporal resolution

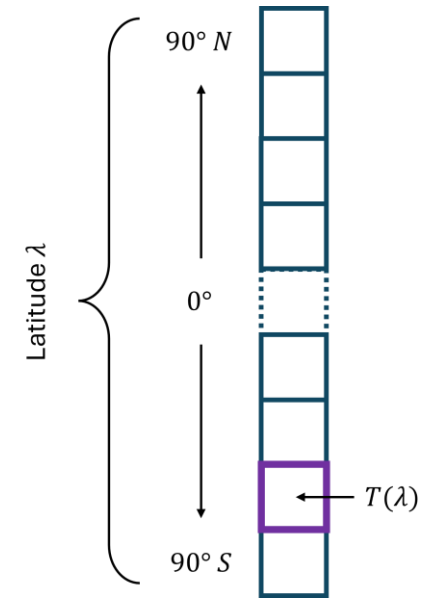


Model **resolution** = **compromise** between simulation **accuracy** and computational **efficiency**

Climate Models

Climate model **hierarchy**

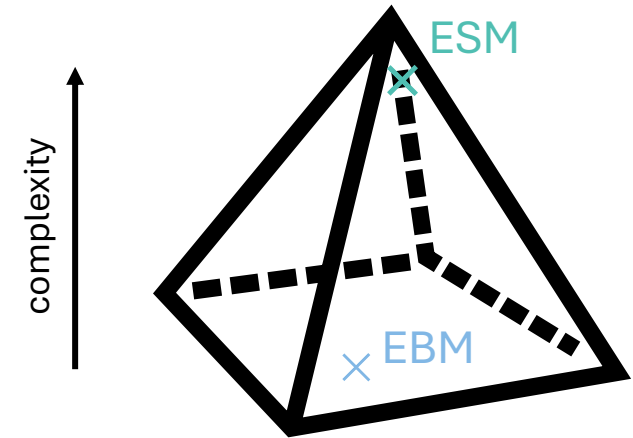
- 1D energy balance model (**EBM**)
- ...
- General circulation model (GCM, concentration driven)
- Earth system model (**ESM**, emission driven)



Climate Models

Climate model **hierarchy**

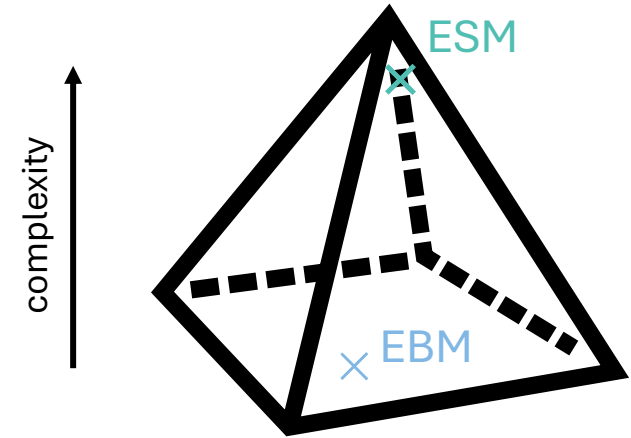
- 1D energy balance model (EBM)
- ...
- General circulation model (GCM, concentration driven)
- Earth system model (ESM, emission driven)



Climate Models

Climate model **hierarchy**

- 1D energy balance model (EBM)
- ...
- General circulation model (GCM, concentration driven)
- Earth system model (ESM, emission driven)



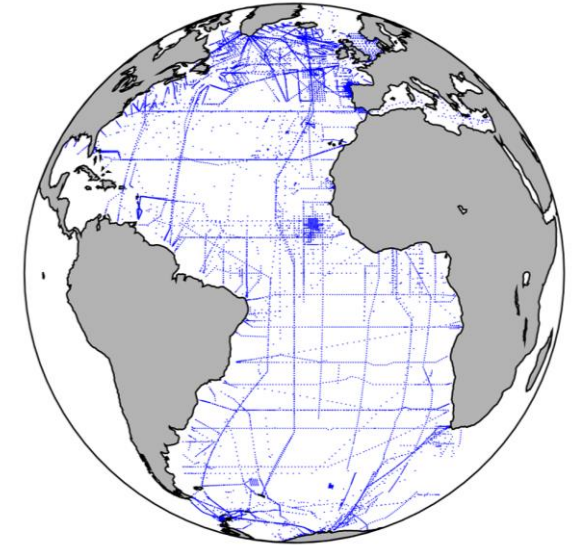
Earth system model

- **Physical climate** components (atmosphere, land, ocean, sea ice, ...)
- **Biogeochemical cycles** (carbon, nitrogen, water cycles)

Using and Testing Earth System Models

Earth system models are used for:

- **Attribution** studies
- **Process** understanding
- Comparison with, or completion of sparse **observations**
- Future climate **projections**



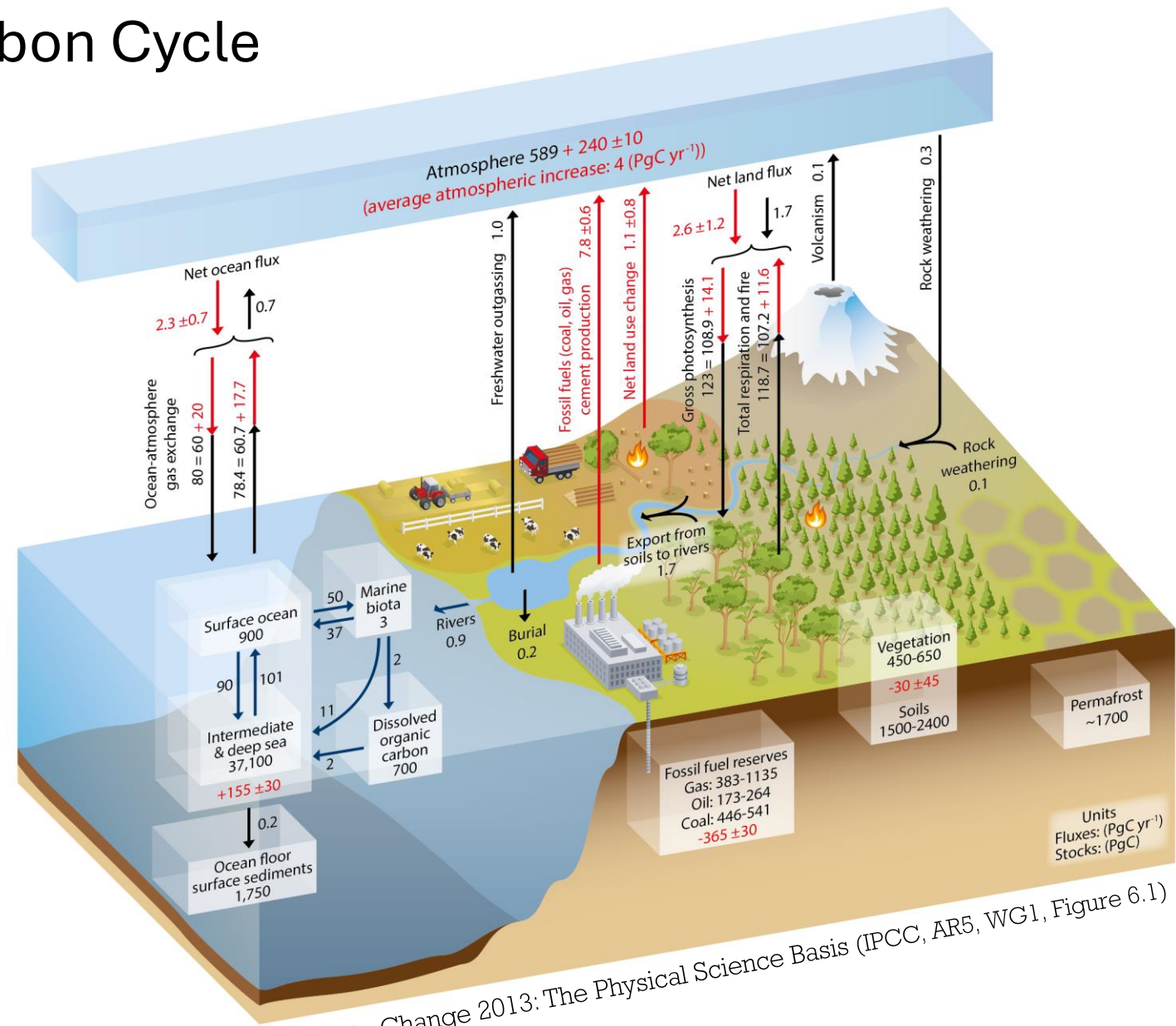
Olsen et al., 2019

Climate model intercomparison project (CMIP):

- Large **collaboration** of modelling centres
- **Compare** model outputs based on a set of **common experiments**
- Assess **model performance** and **uncertainties**

- 1. Climate Modelling**
- 2. Carbon Cycle**
- 3. Safe Emission Pathways**

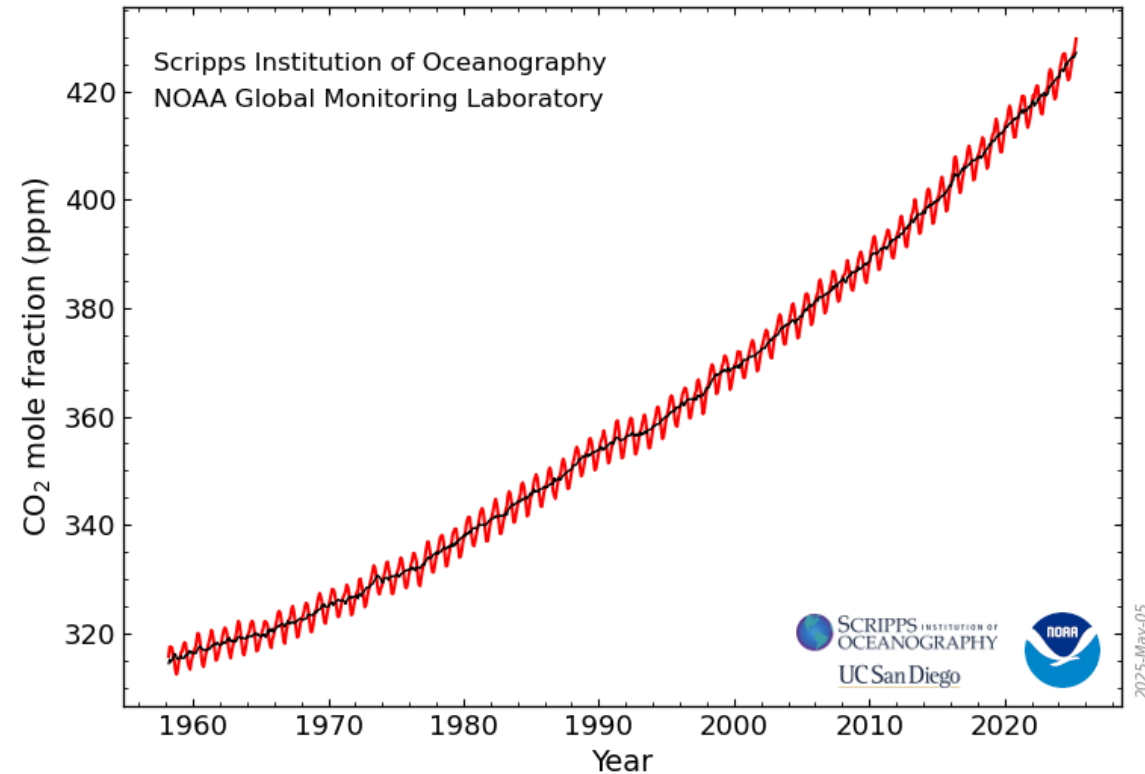
Global Carbon Cycle



Climate Change 2013: The Physical Science Basis (IPCC, AR5, WG1, Figure 6.1)

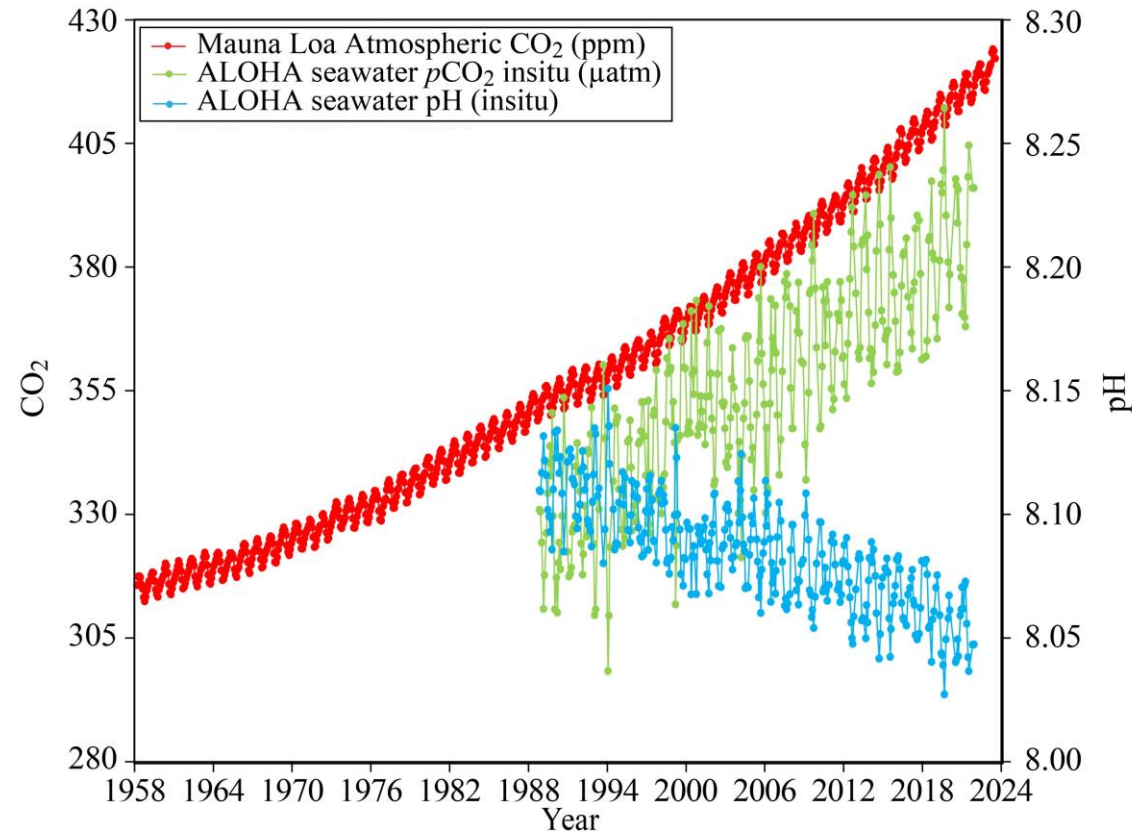
- 1. Climate Modelling**
- 2. Carbon Cycle**
- 3. Safe Emission Pathways**

Atmospheric CO₂ increases since preindustrial period



CO₂ uptake by the ocean causes ocean acidification

Part of **atmospheric CO₂** dissolves in seawater.

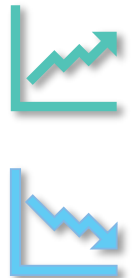
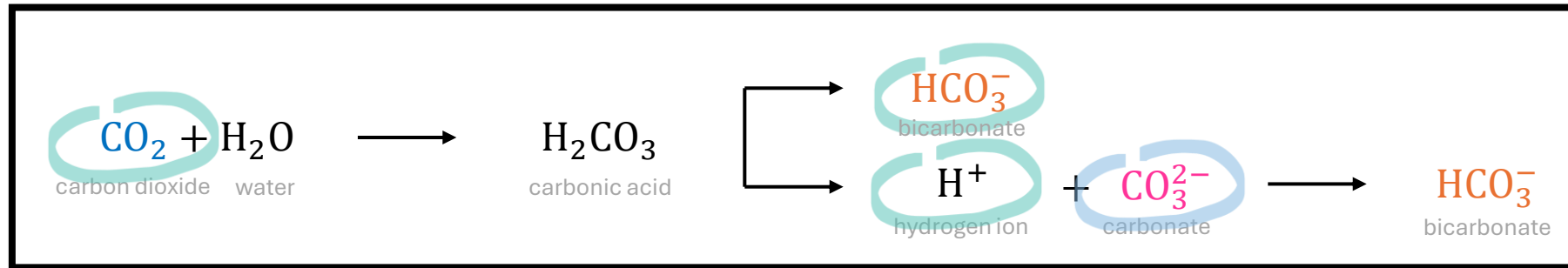


Impacts on **seawater chemistry** and decrease of **pH**

Data: Mauna Loa (https://gml.noaa.gov/webdata/ccgg/trends/co2/co2_mm_mlo.txt) ALOHA (https://hahana.soest.hawaii.edu/hot/hotco2/HOT_surface_CO2.txt)
ALOHA pH & pCO₂ are calculated at in-situ temperature from DIC & TA (measured from samples collected on Hawaii Ocean Times-series (HOT) cruises)
using co2sys (Pelletier, v25b06) with constants: Lueker et al. 2000, KSO4: Dickson, Total boron: Lee et al. 2010, & KF: seacarb

CO₂ uptake by the ocean affects seawater chemistry

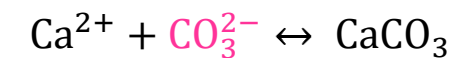
Part of atmospheric **CO₂** **dissolves** in seawater:



[H⁺] increases ⇔ pH decreases

$$\text{pH} = -\log([\text{H}^+])$$

[CO₃²⁻] limits calcification process:



Ocean acidification impacts marine calcifying organisms

Pteropods



Peijnenburg et al., 2020

Calcifying species:

Corals
Plankton
Pteropods (e.g. sea butterfly)

Effects:

Reduced calcification rate
Reduced growth rate
Species-specific

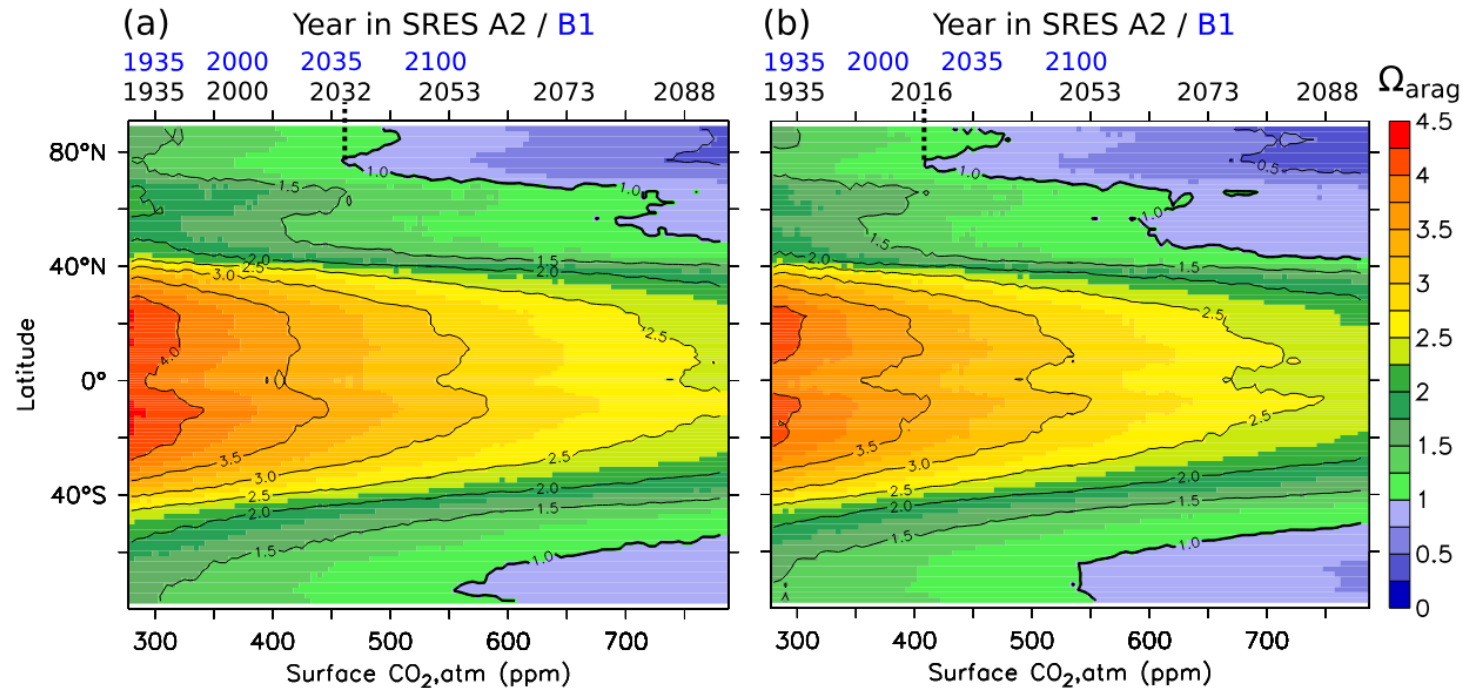
Aragonite saturation state:

$$\Omega_{\text{arag}} = \frac{[\text{CO}_3^{2-}][\text{Ca}^{2+}]}{[\text{CO}_3^{2-}]_{\text{sat, arag}}[\text{Ca}^{2+}]_{\text{sat, arag}}}$$

$\Omega_{\text{arag}} > 1$, inorganic precipitation
 $\Omega_{\text{arag}} = 1$, equilibrium
 $\Omega_{\text{arag}} < 1$, inorganic dissolution

The Arctic is projected to become undersaturated soon

- a) Annual-mean
- b) Lowest monthly mean

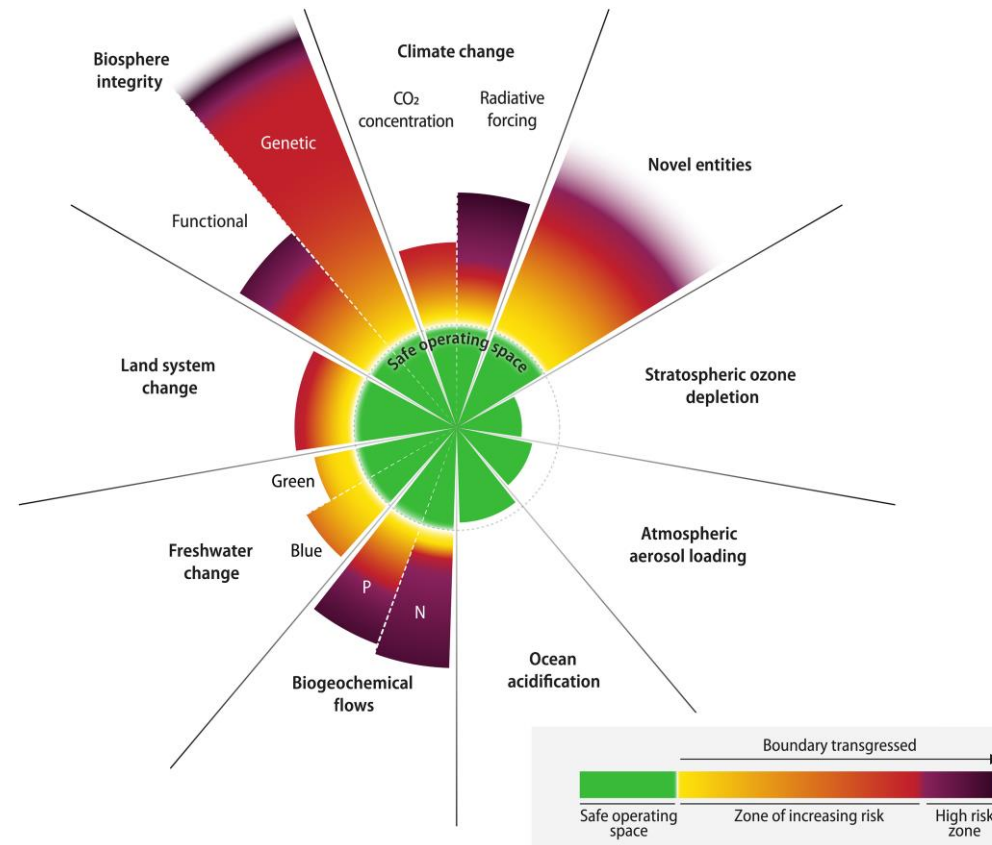


Steinacher et al., 2009

Projections for surface water **undersaturation** in the **Arctic**: within a few **decades**.

Many planetary boundaries are outside their safe operating space

Status in **2023** of
control variables
for nine planetary
boundaries



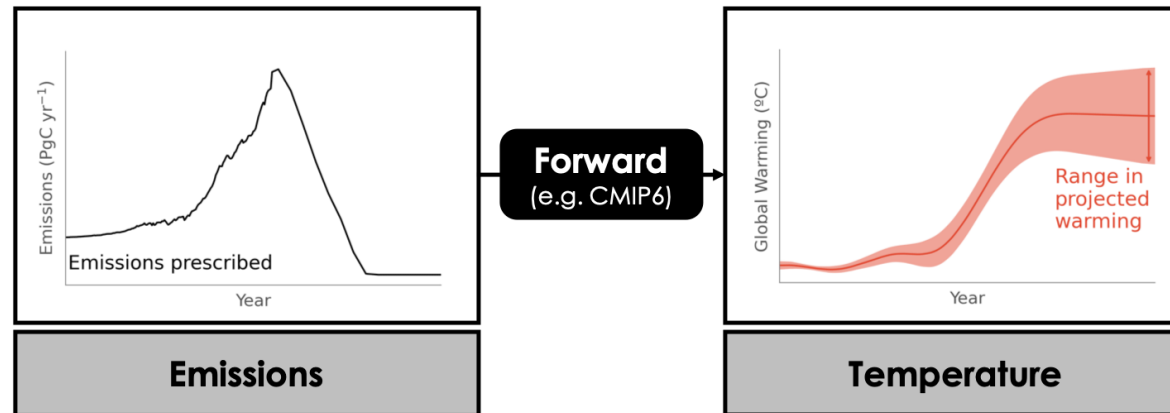
Ocean acidification is
approaching its
boundary.

Richardson et al., 2023

Rockström et al., 2009

Climate model projections should provide safe emission pathways

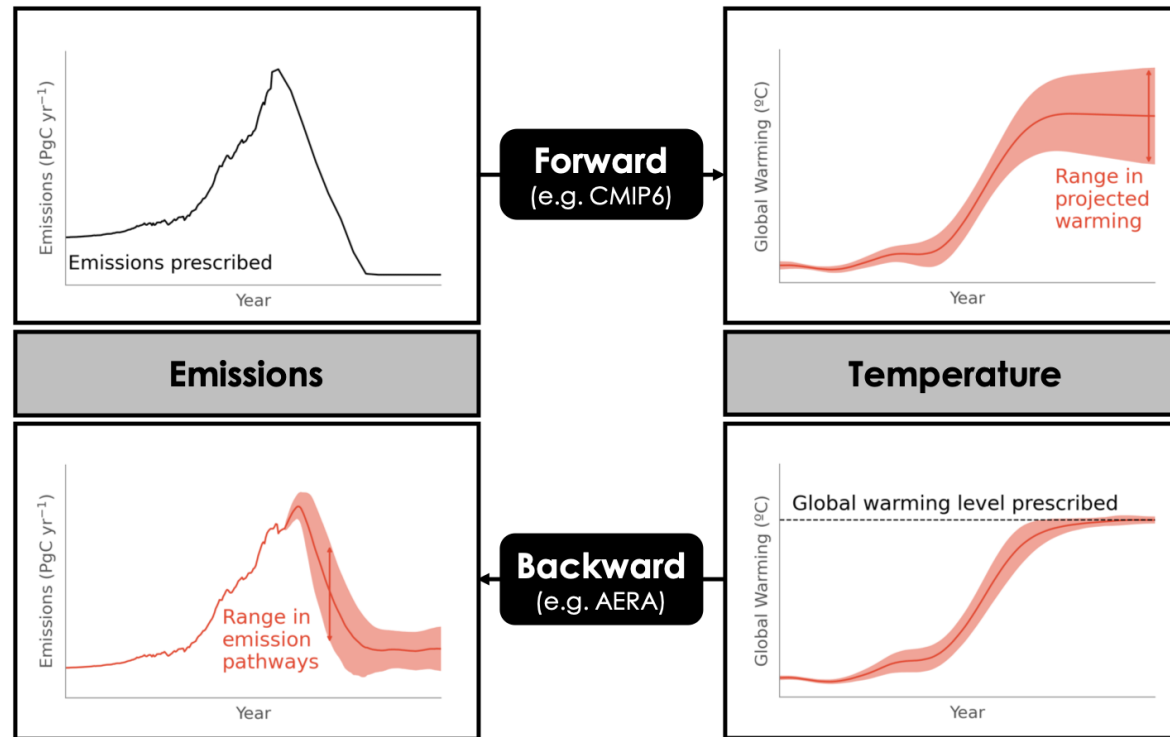
Currently, most climate projections are based on **prescribed emission pathways**.



Silvy et al., 2024
Terhaar et al., 2022

Climate model projections should provide safe emission pathways

Currently, most climate projections are based on **prescribed emission pathways**.

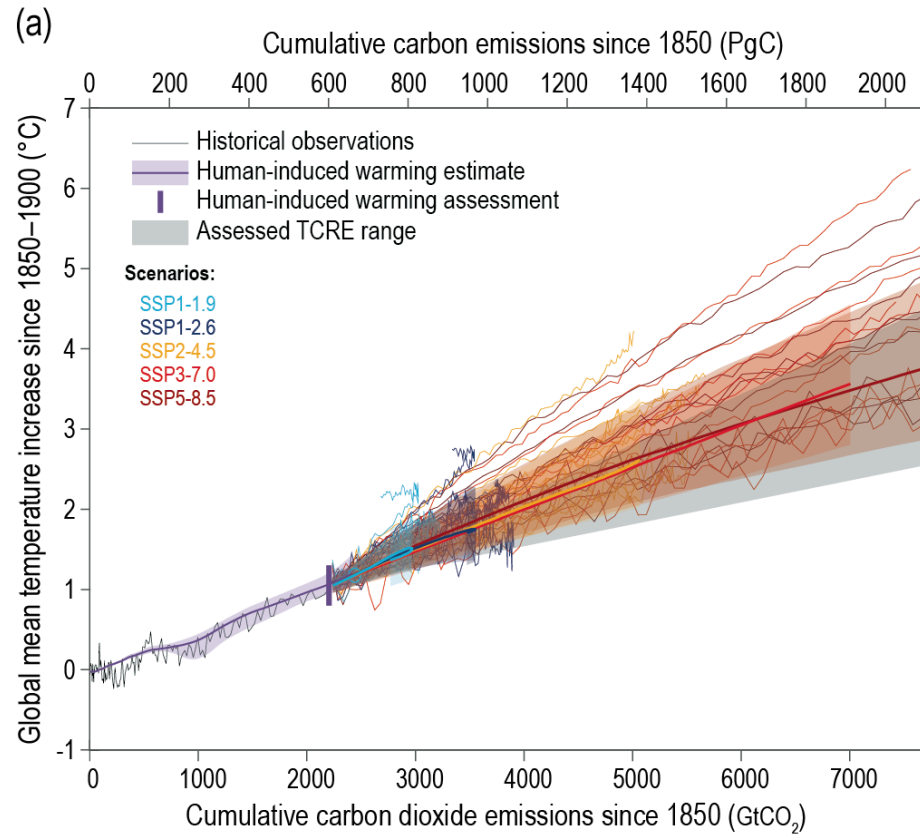


AERA determines the emission pathways allowing global warming to **stabilise at the threshold**.

Silvy et al., 2024

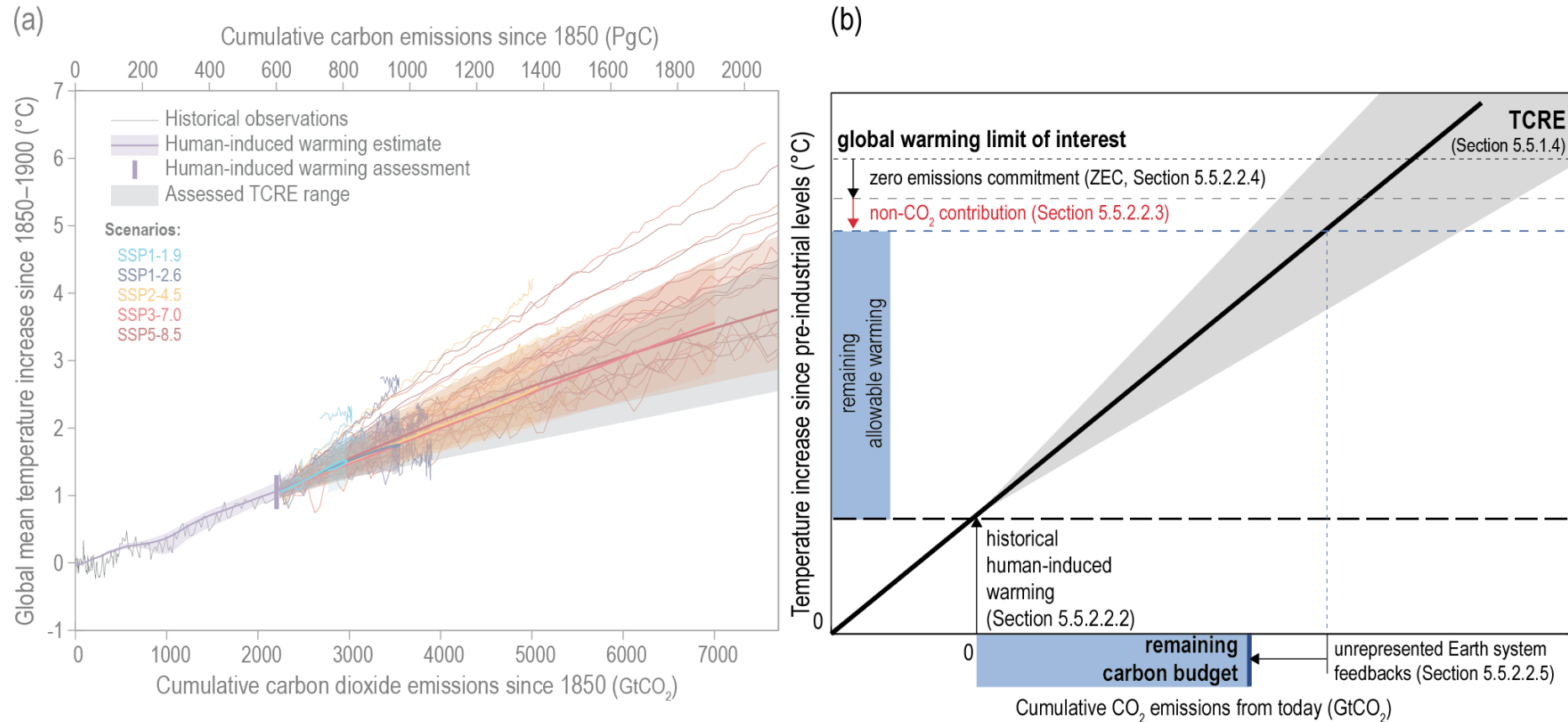
Terhaar et al., 2022

Estimate remaining emission budget from cumulative emissions and global warming



Climate Change 2021: The Physical Science Basis
(IPCC, AR6, WG1, Figure TS.18 & Chapter 5.5.1)

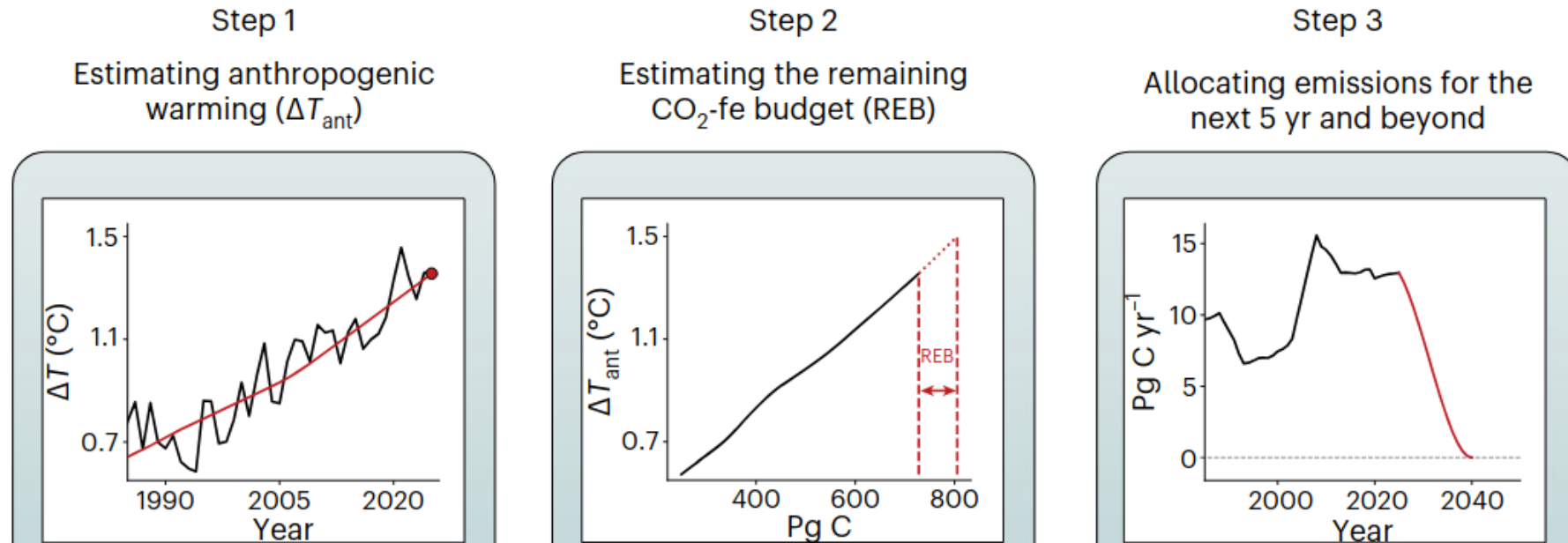
Estimate remaining emission budget from cumulative emissions and global warming



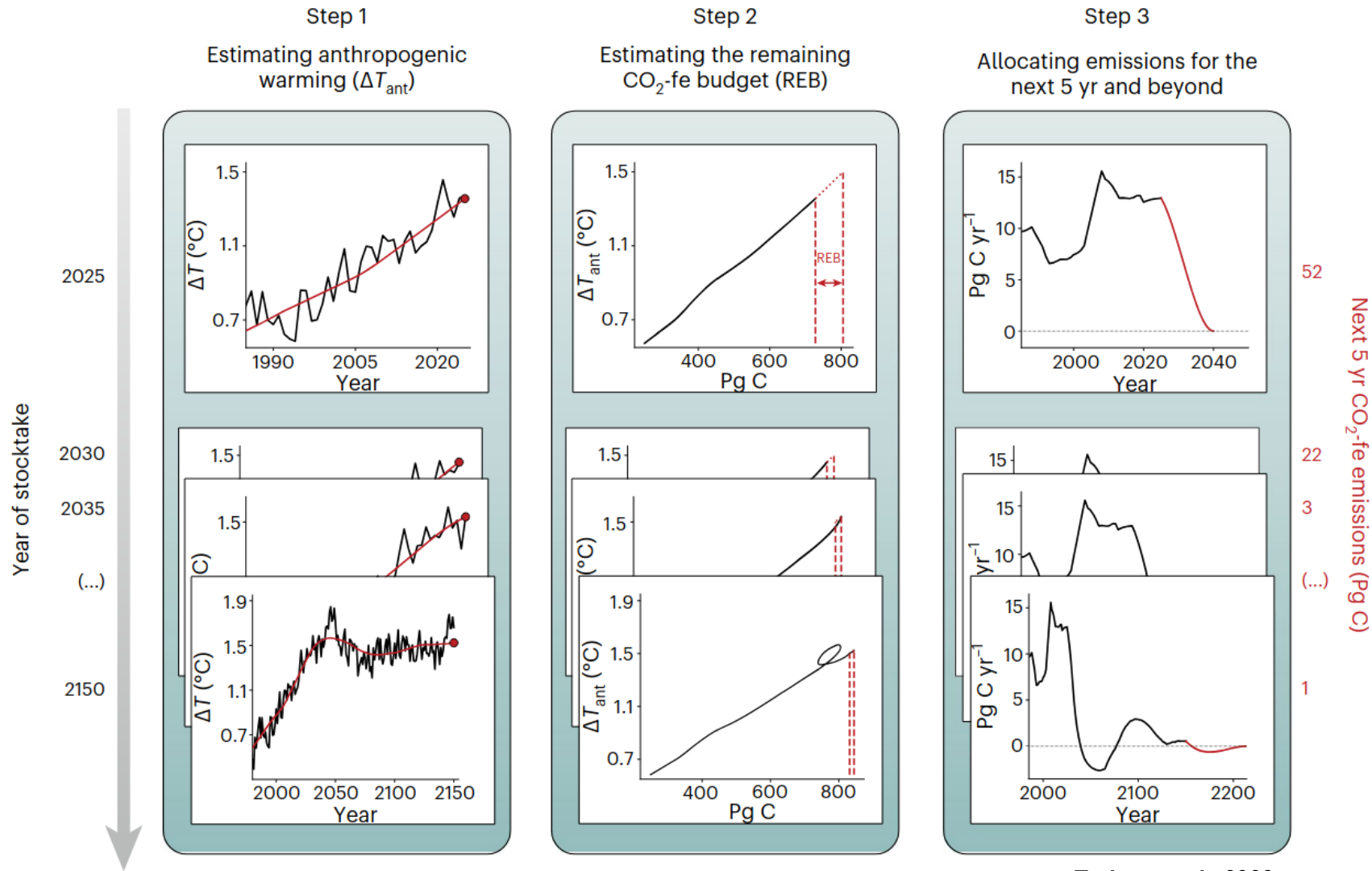
Climate Change 2021: The Physical Science Basis
(IPCC, AR6, WG1, Figure TS.18 & Chapter 5.5.1)

Adaptive Emission Reduction Approach

Terhaar et al., 2022



AERA provides emission pathways that stabilise global warming

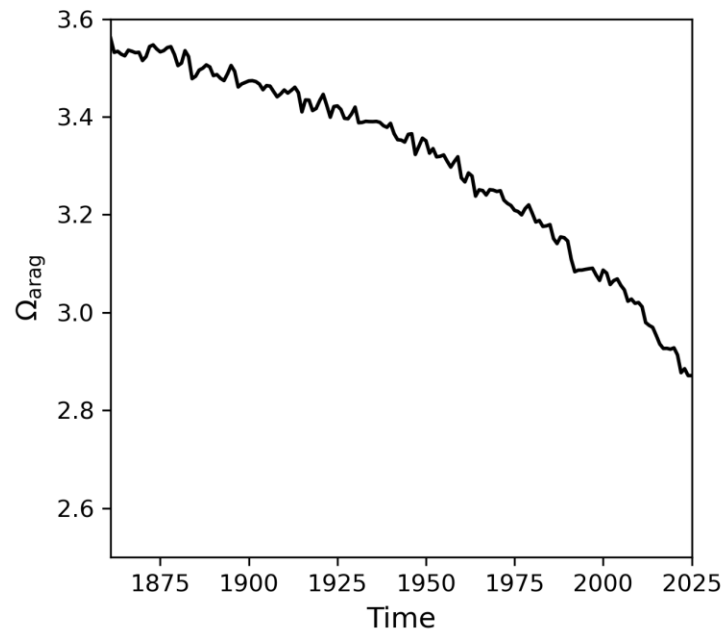


Terhaar et al., 2022

We want to extend AERA to an ocean acidification target

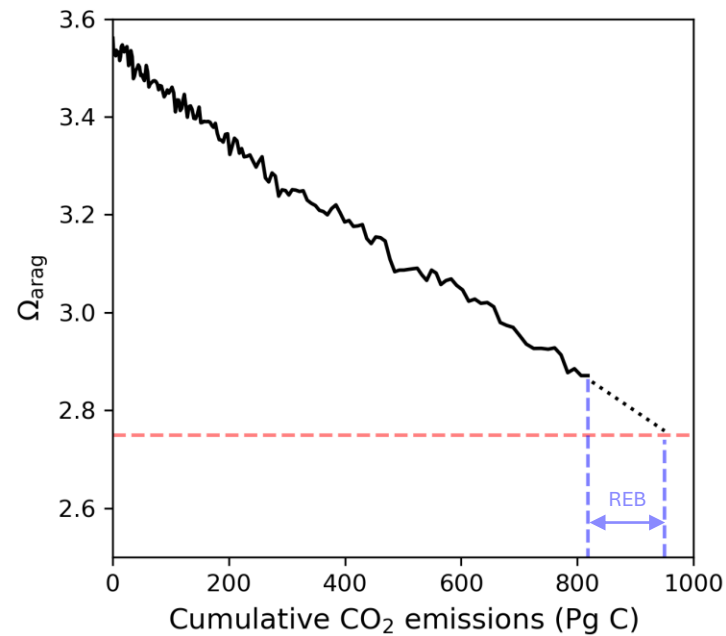
Step 1

Estimate the decrease in aragonite saturation state



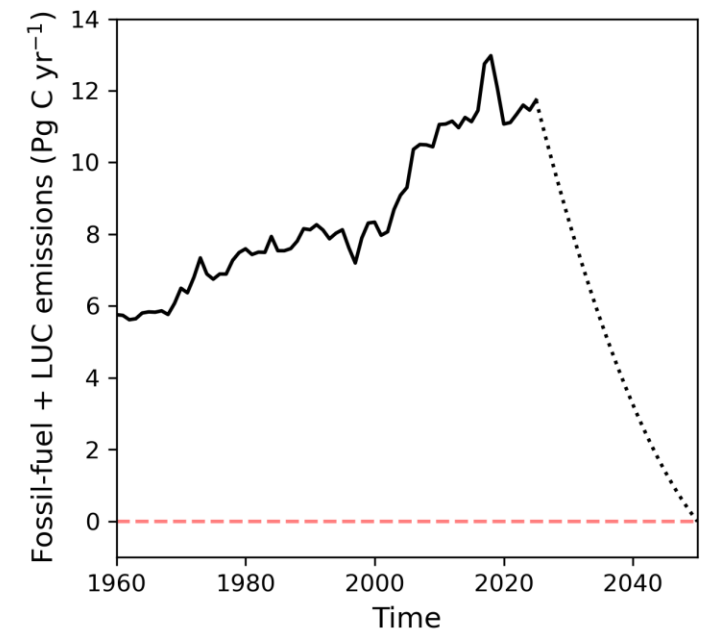
Step 2

Estimate the remaining CO₂ emission budget (REB)

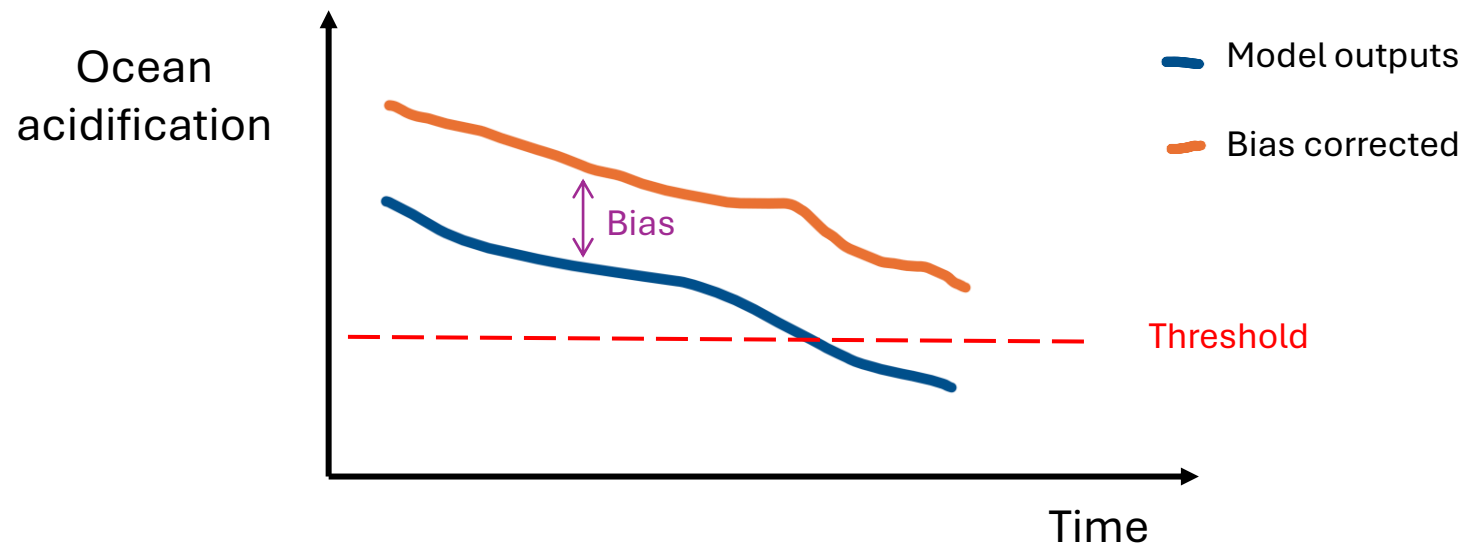


Step 3

Allocate emissions for the next five years and beyond



Real-world acidification targets require model bias correction



Positive	bias ↔ Control variable in the model is	higher
Negative		lower
than observations.		

The bias correction is performed on ocean acidification drivers

Ocean acidification **drivers**:

- Sea surface temperature
- Dissolved inorganic carbon
- Alkalinity
- Salinity
- Silicate
- Phosphate

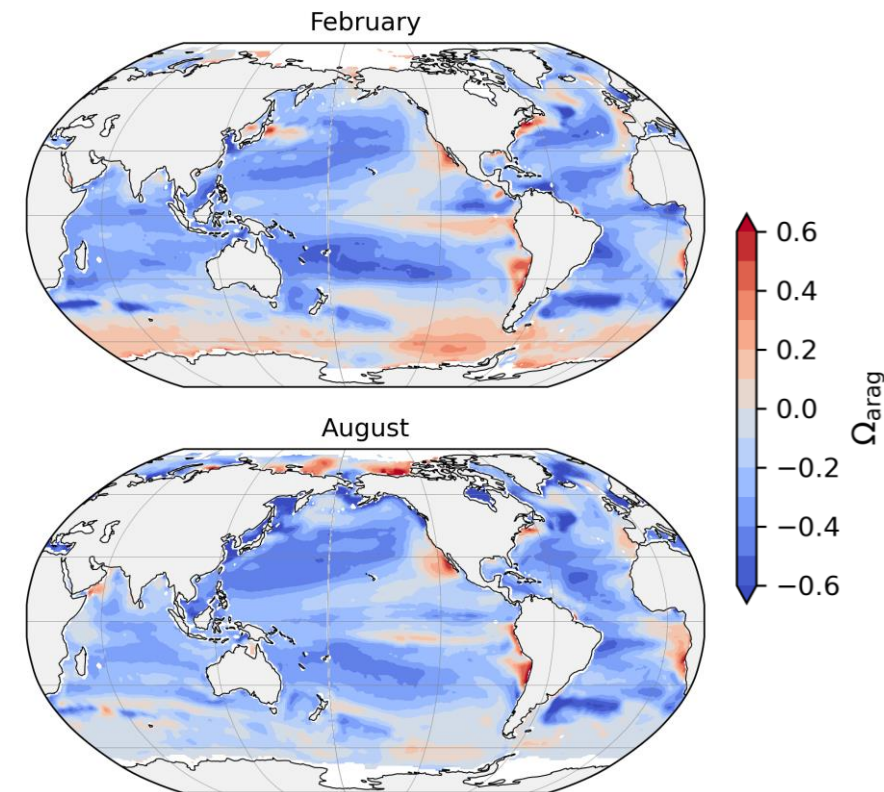
Observation **datasets**:

Gregor & Gruber, 2021 (OceanSODA-ETHZ, 1993-2022)

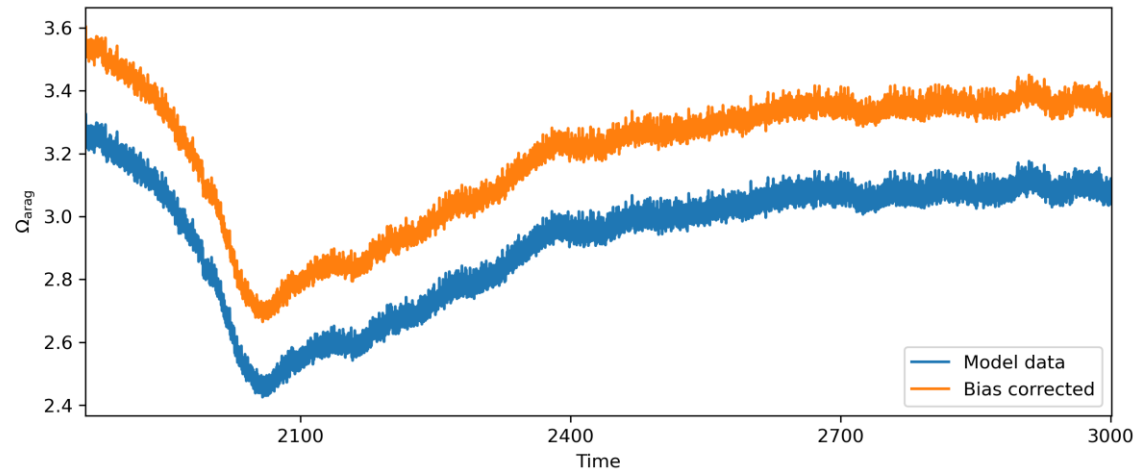
Garcia et al., 2024 (WOA, 1991-2020)

**Satellite-based
observations → missing
data under sea ice**

Aragonite saturation state, monthly bias (Sim-Obs 1993-2022)



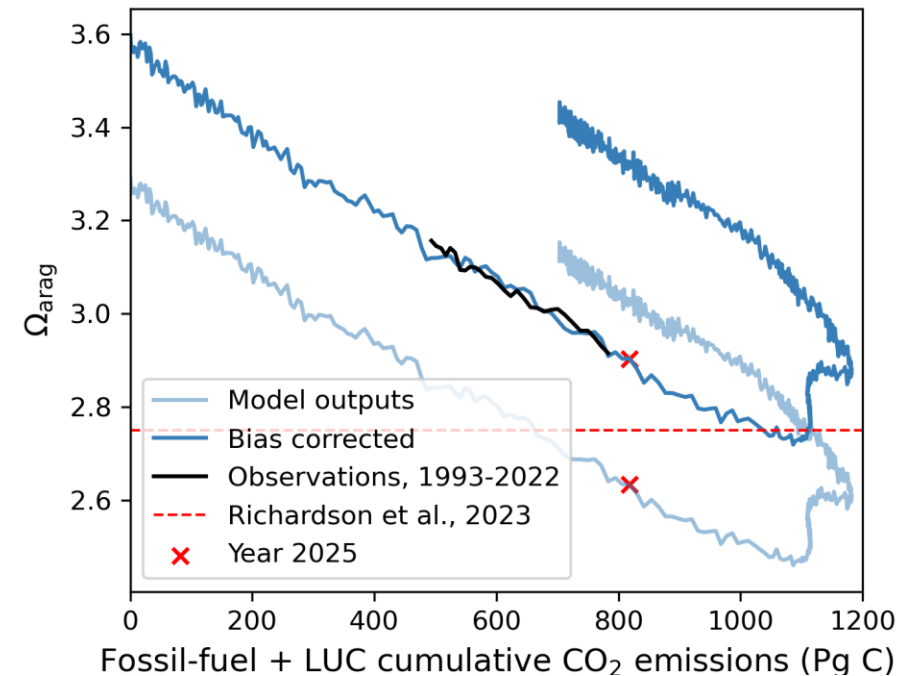
Ω_{arag} scales linearly against cumulative CO₂ emissions



Before emission stabilisation:
Linear regime (TCRE)
Condition required by AERA

After emission stabilisation:
Hysteresis

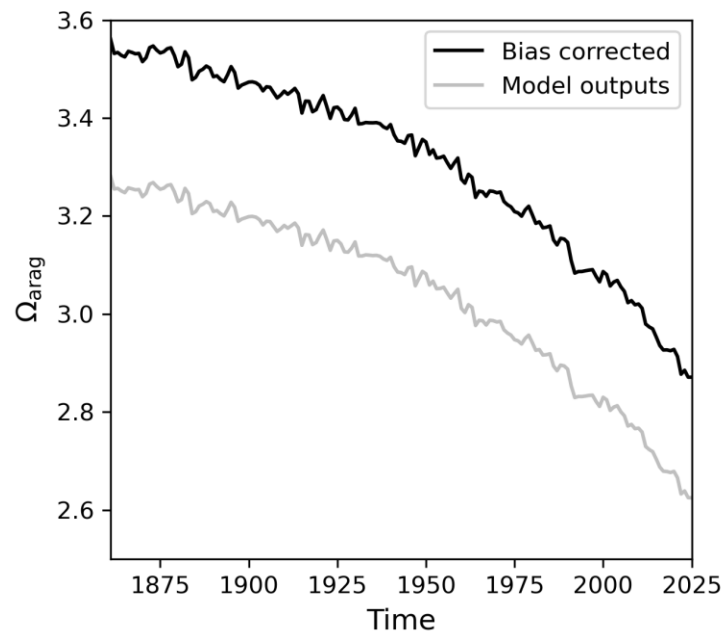
GFDL-ESM2M Ω_{arag} time series is **negatively biased.**



Next step: implement acidification target in AERA

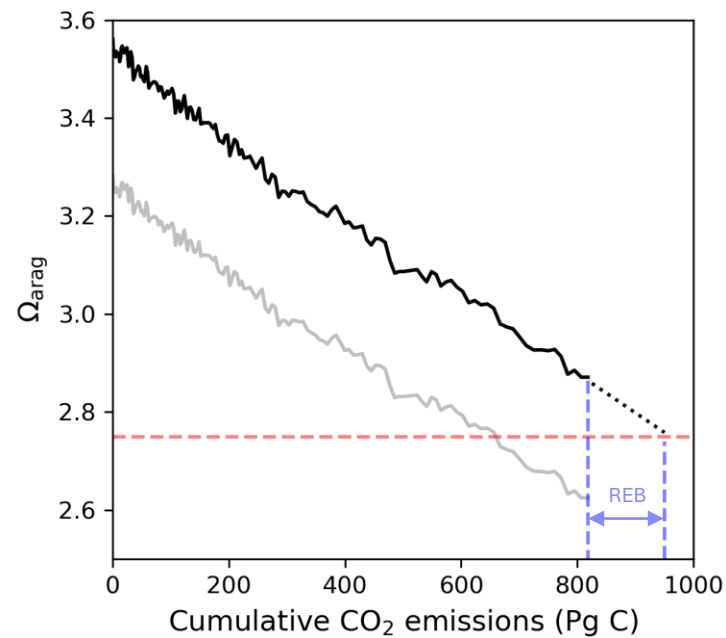
Step 1

Estimate the decrease in aragonite saturation state



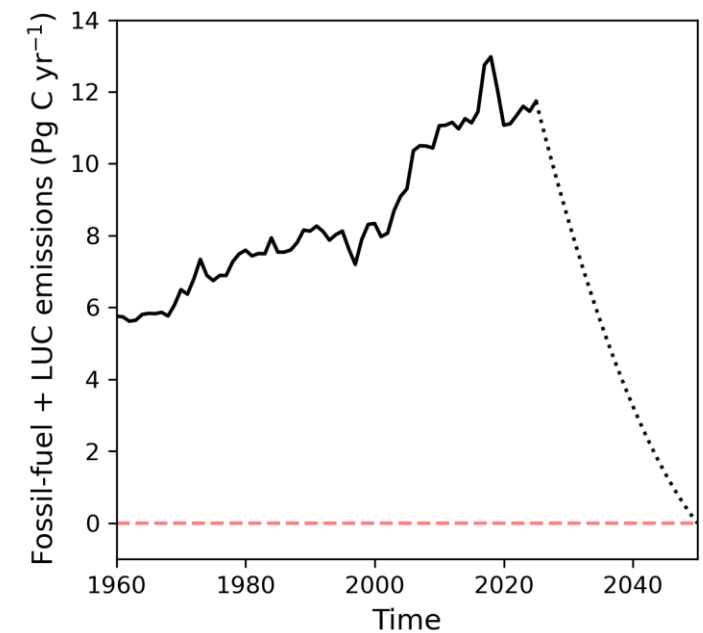
Step 2

Estimate the remaining CO_2 emission budget (REB)



Step 3

Allocate emissions for the next five years and beyond



Take home messages



Ocean acidification impacts **calcifying organisms** and threatens **high latitudes** ecosystems.



Global warming scales **near-linearly** with cumulative CO₂ emissions.



Earth system models can be used to compute **safe emission pathways** for global mean **temperature**.



We extend the **adaptive emission reduction approach** to ocean **acidification targets**.



Real-world acidification **thresholds** require **model bias correction**.

Thank you for your attention!

References

The Earth's Climate System, Geomar, <https://www.geomar.de/en/discover/ocean-and-climate/model-simulations/the-earths-climate-system> (30.07.2025)

Climate Models, NOAA, Climate.gov, <https://www.climate.gov/maps-data/climate-data-primer/predicting-climate/climate-models> (30.07.2025)

Qu'est-ce qu'un modèle climatique ? INSU, CNRS Terre et Univers, <https://www.insu.cnrs.fr/fr/les-modeles-climatiques> (30.07.2025)

Weather and Climate Models course, Earth System Models, Martin Wild (ETHZ), https://ethz.ch/content/dam/ethz/special-interest/usys/iac/iac-dam/documents/edu/courses/weather_and_climate_models/FS2024/07_slides_ESMs.pdf (30.07.2025)

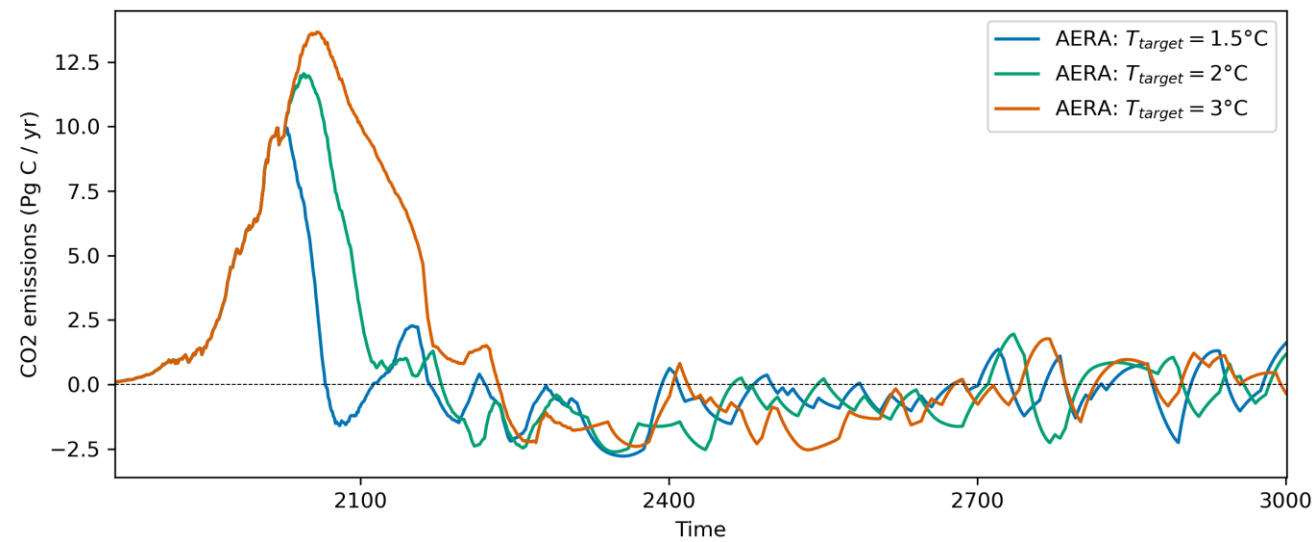
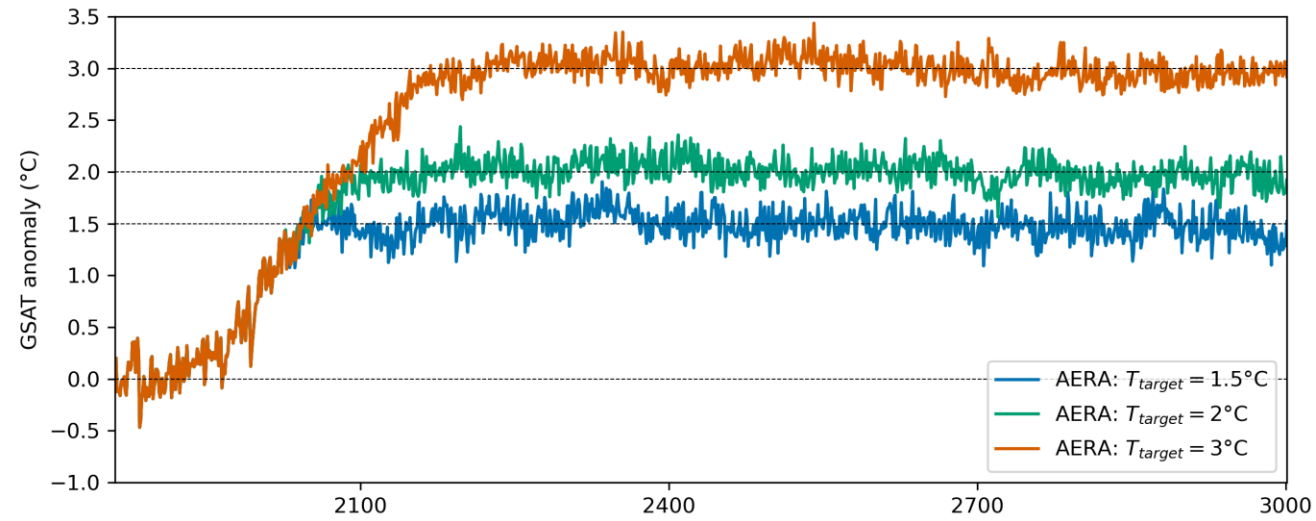
Olsen, A., Lange, N., Key, R. M., Tanhua, T., Álvarez, M., Becker, S., Bittig, H. C., Carter, B. R., Cotrim da Cunha, L., Feely, R. A., van Heuven, S., Hoppema, M., Ishii, M., Jeansson, E., Jones, S. D., Jutterström, S., Karlsen, M. K., Kozyr, A., Lauvset, S. K., Lo Monaco, C., Murata, A., Pérez, F. F., Pfeil, B., Schirnick, C., Steinfeldt, R., Suzuki, T., Telszewski, M., Tilbrook, B., Velo, A., and Wanninkhof, R.: GLODAPv2.2019 – an update of GLODAPv2, Earth Syst. Sci. Data, 11, 1437–1461, <https://doi.org/10.5194/essd-11-1437-2019>, 2019.

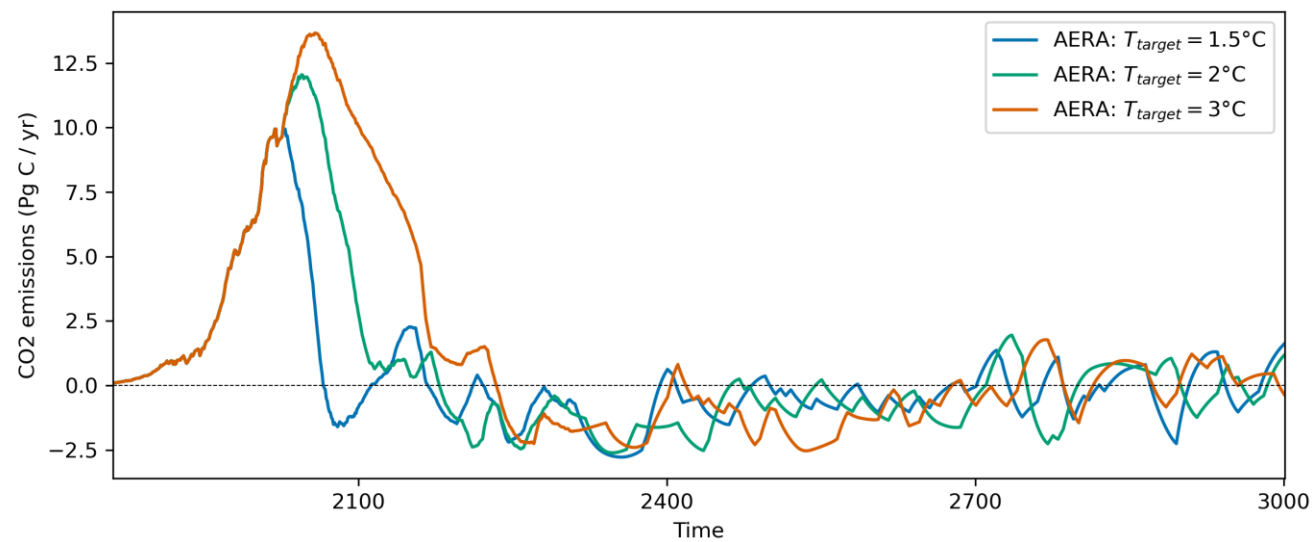
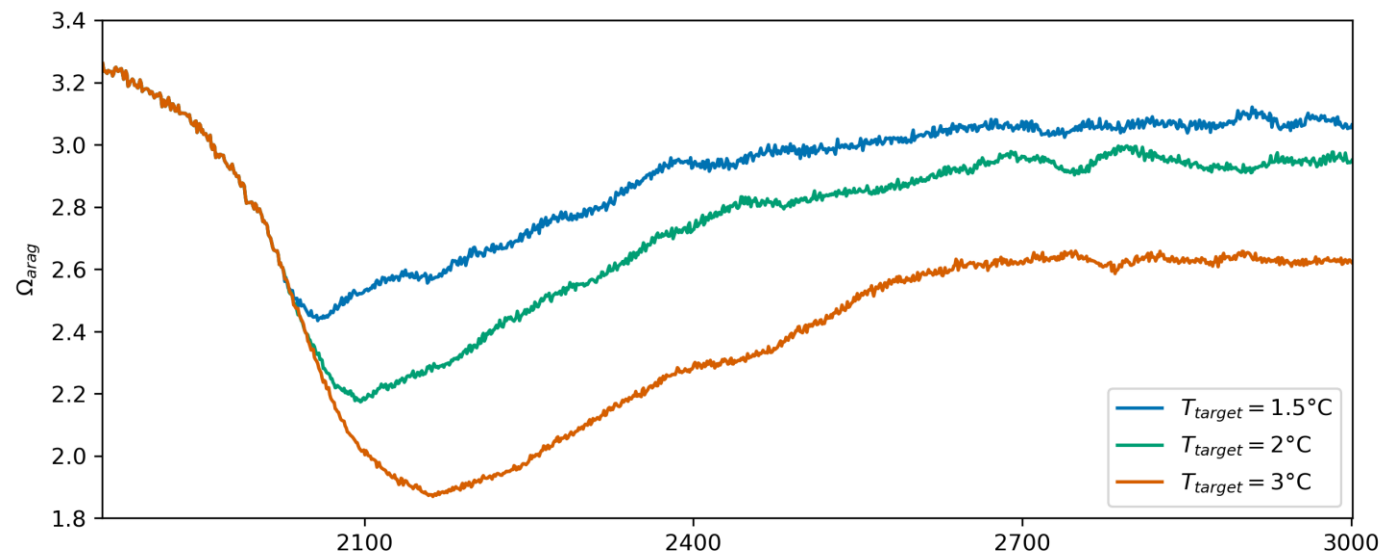
Figure 9 (b)

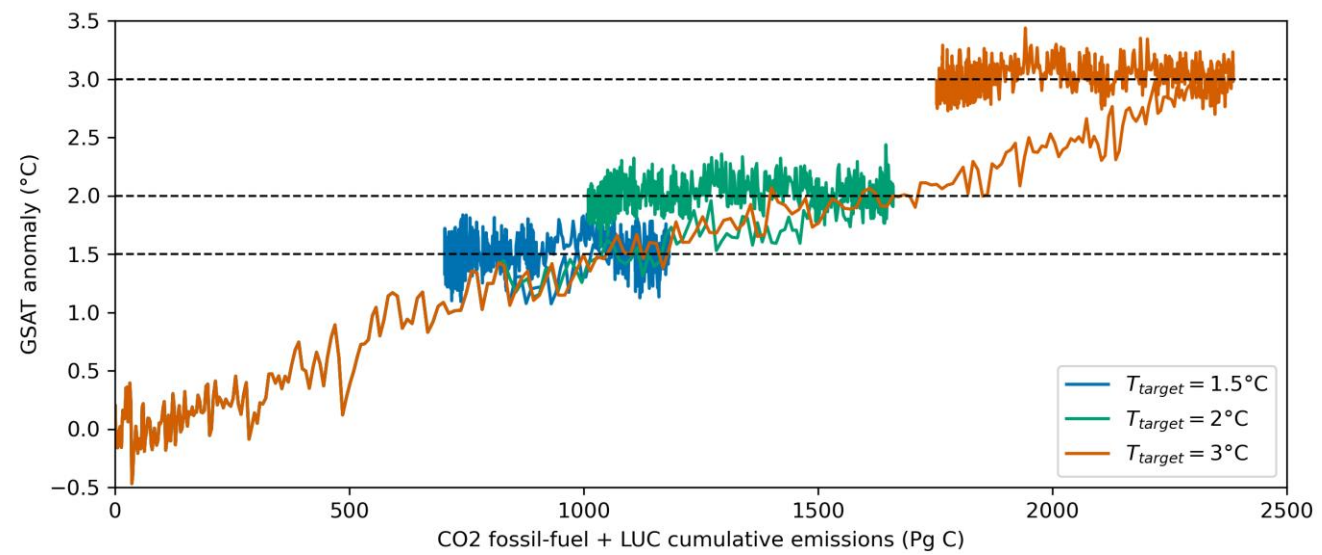
Figure 6.1 in IPCC, 2013: Ciais, P., C. Sabine, G. Bala, L. Bopp, V. Brovkin, J. Canadell, A. Chhabra, R. DeFries, J. Galloway, M. Heimann, C. Jones, C. Le Quéré, R.B. Myneni, S. Piao and P. Thornton, 2013: Carbon and Other Biogeochemical Cycles. In: Climate Change 2013: The Physical Science Basis. Contribution of Working Group I to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change [Stocker, T.F., D. Qin, G.-K. Plattner, M. Tignor, S.K. Allen, J. Boschung, A. Nauels, Y. Xia, V. Bex and P.M. Midgley (eds.)]. Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA.

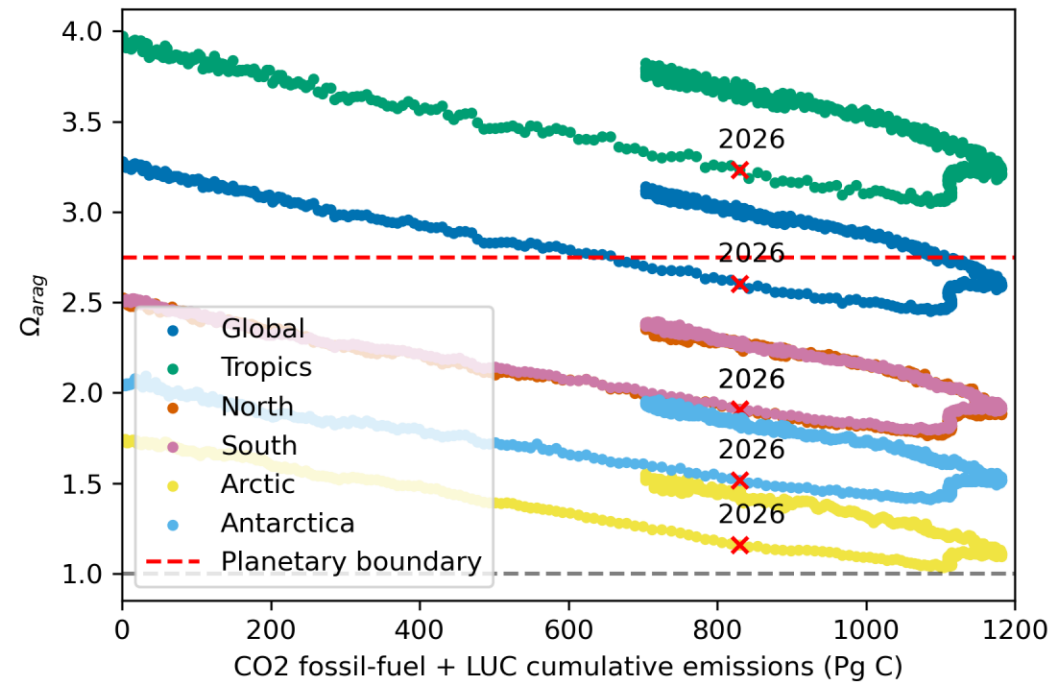
Figure TS.18 in IPCC, 2021: Technical Summary. In: Climate Change 2021: The Physical Science Basis. Contribution of Working Group I to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change [Chen, D., M. Rojas, B.H. Samset, K. Cobb, A. Diongue Niang, P. Edwards, S. Emori, S.H. Faria, E. Hawkins, P. Hope, P. Huybrechts, M. Meinshausen, S.K. Mustafa, G.-K. Plattner, and A.-M. Tréguier, 2021: Framing, Context, and Methods. In: Climate Change 2021: The Physical Science Basis. Contribution of Working Group I to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change [Masson-Delmotte, V., P. Zhai, A. Pirani, S.L. Connors, C. Péan, S. Berger, N. Caud, Y. Chen, L. Goldfarb, M.I. Gomis, M. Huang, K. Leitzell, E. Lonnoy, J.B.R. Matthews, T.K. Maycock, T. Waterfield, O. Yelekçi, R. Yu, and B. Zhou (eds.)]. Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA, pp. 147–286, doi:[10.1017/9781009157896.003](https://doi.org/10.1017/9781009157896.003).]

Additional slides









Monthly bias, Sim-Obs, 1993-2022

