

AIDE- SAI

AI-Driven Emulation for SAI

Disentangle and quantify cross-scale uncertainty
in Stratospheric Aerosol Injection (SAI)

¹**Reflective** , San Francisco, CA, USA

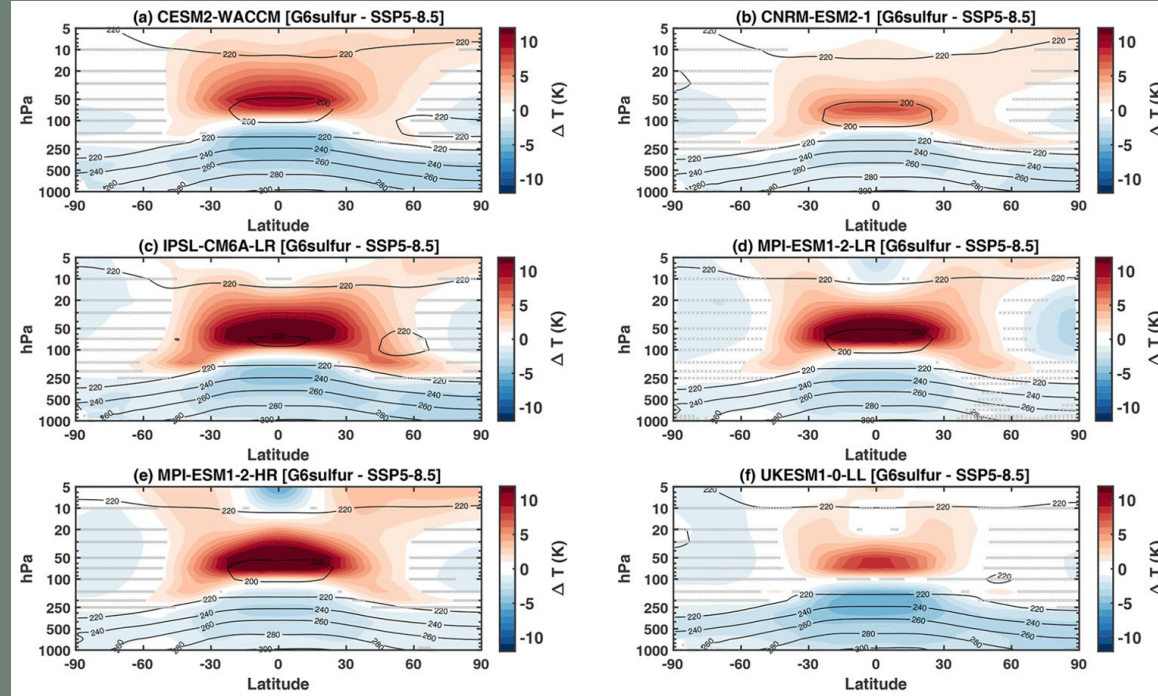
²**Cornell University** , Ithaca, NY, USA

³**Harvard University** , Cambridge, MA, USA

⁴**Scripps** , University of San Diego, San Diego, CA, USA

⁵**University of Wyoming** , Laramie, WY 82071, USA

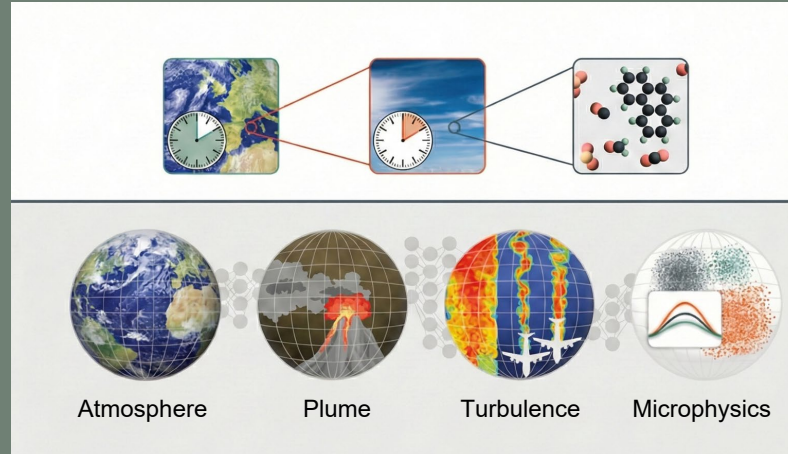
Large uncertainties around chemistry feedback on stratospheric temperature and tracer transport



Tilmes et al. 2022:

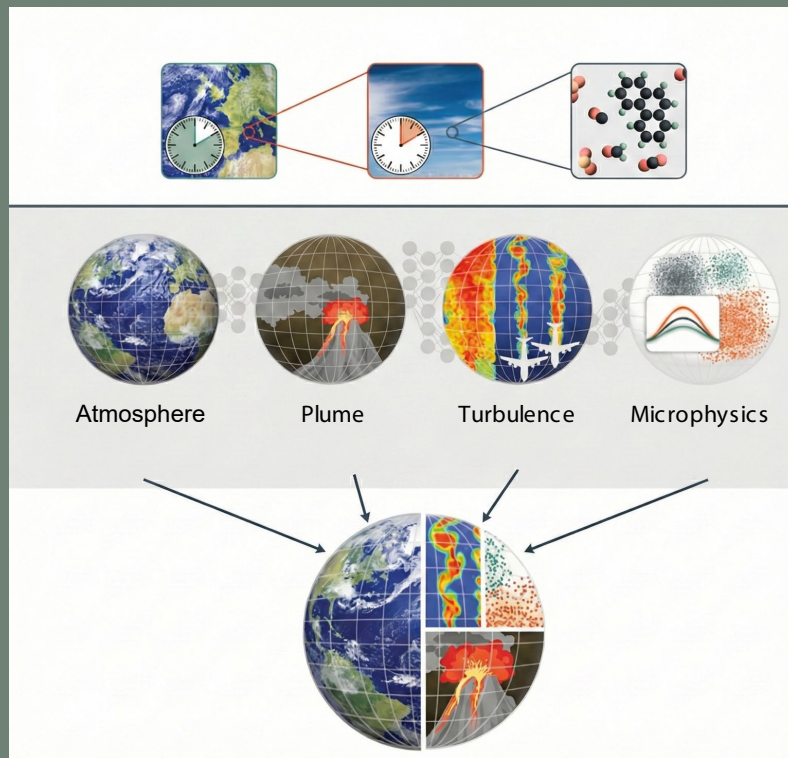
Zonal mean temperature changes (2080-2099) between G6sulfur and SSP5-8.5

There are multiple spatial and temporal scales involved



Vision

An emulator that couples processes across spatial and temporal scales
→ faster, more precise exploration of key physical uncertainties in SAI

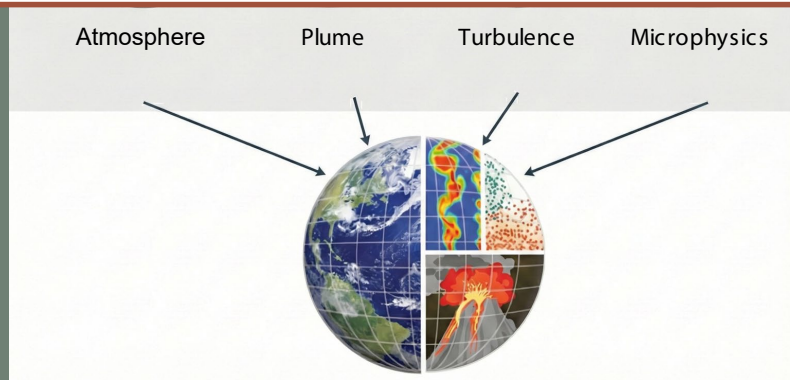


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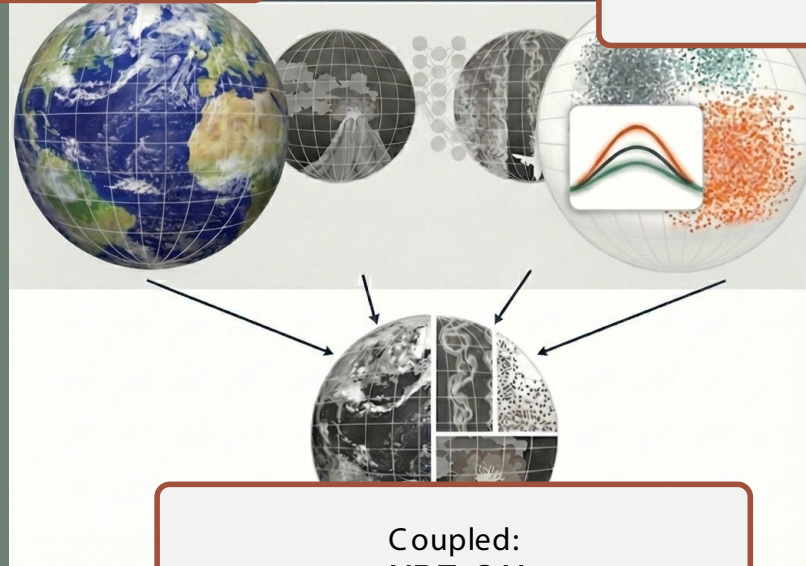
An open-source tool to disentangle and quantify cross - scale
uncertainty in stratospheric processes related to SAI



Focus on **smallest** and **largest** scales first

Atmospheric scale: **AIDE-
WACCM**

Microphysics scale: **AIDE-
microphysics**



Coupled:
AIDE- SAI



AIDE- WACCM

Emulate stratospheric dynamics



AIDE- WACCM

Emulate stratospheric dynamics

30x faster than
baseline model



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Large multi- member
ensemble for
scenario space
analysis

1h historical only training data
with fixed SSTs from CESM2
WACCM6



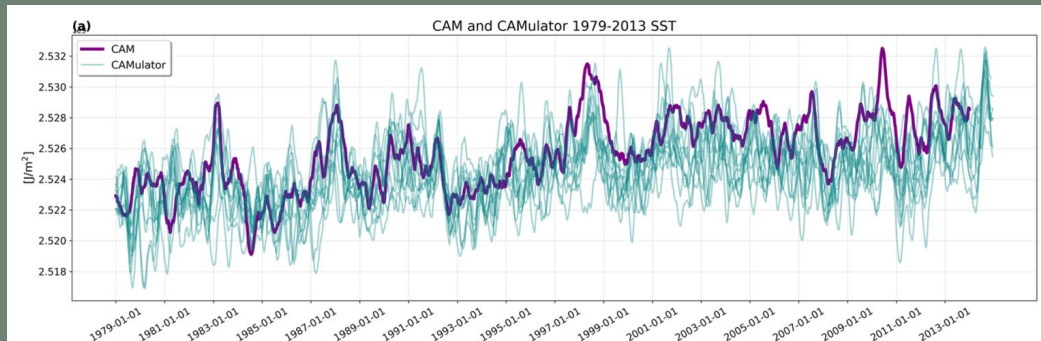
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AIDE- microphysics

Emulate aerosol nucleation, growth
and size distribution from SO₂
injections



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As accurate as
sectional models, as
fast as modal models

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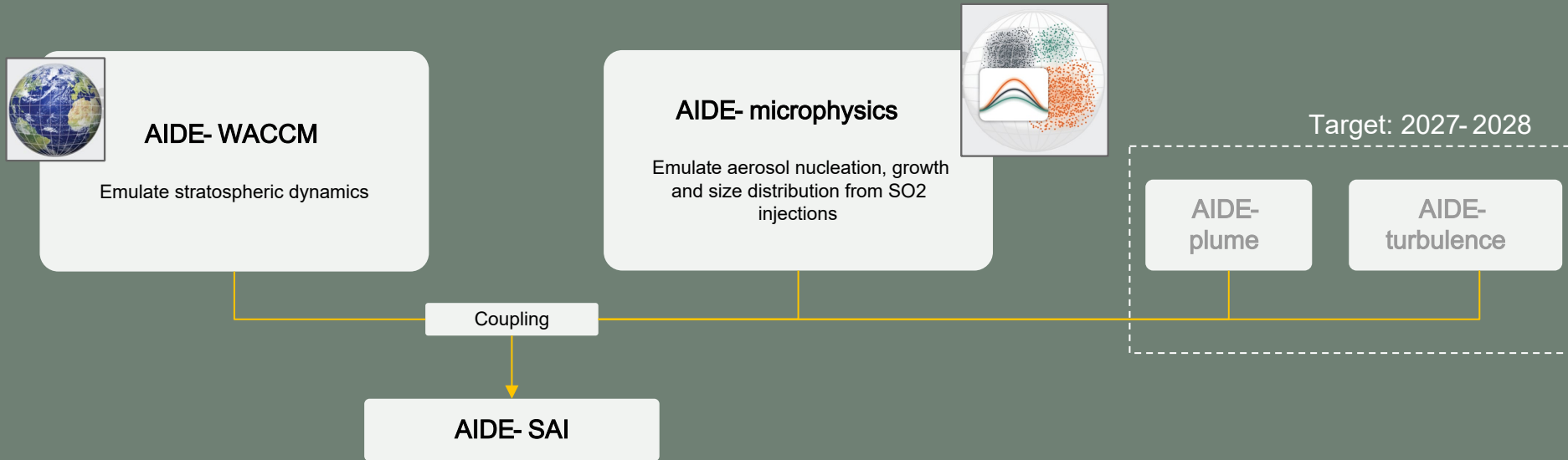


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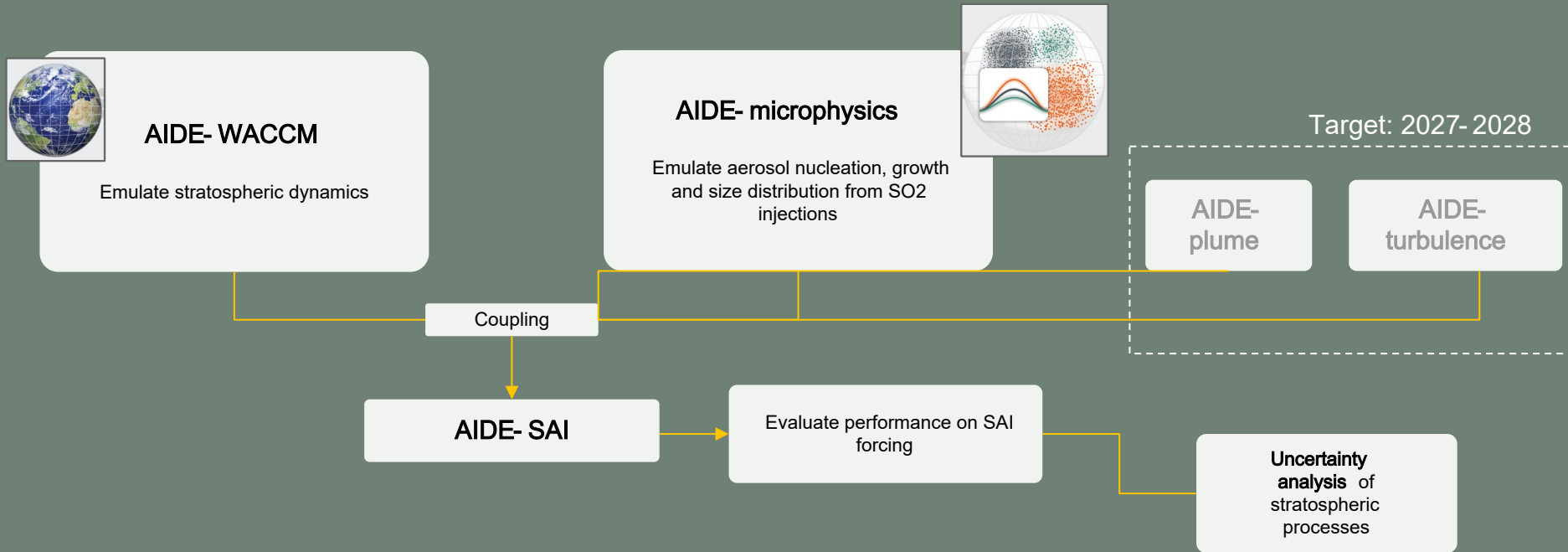
Exploration of
**chemistry and
aerosol formation**

CARMA, TOMAS, AER3D with
CESM2 WACCM6 boundary
conditions

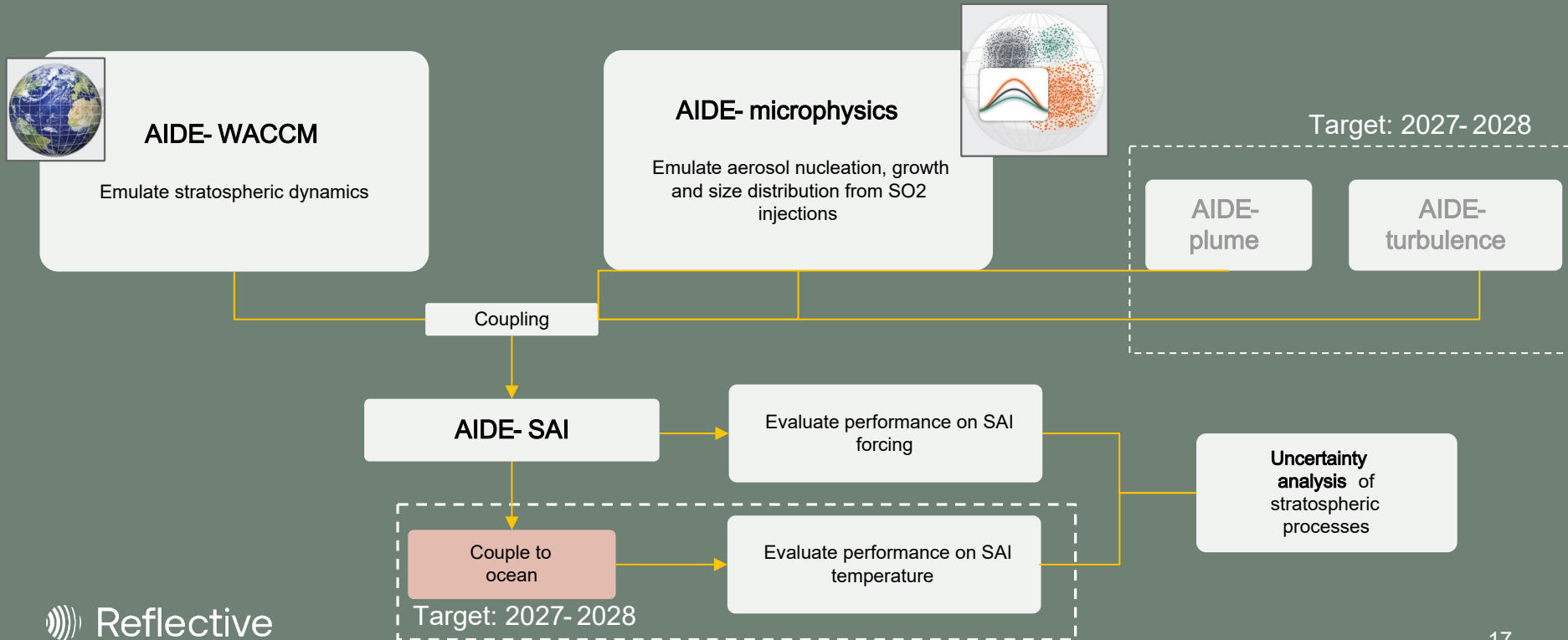
Multi-Scale Modeling Framework



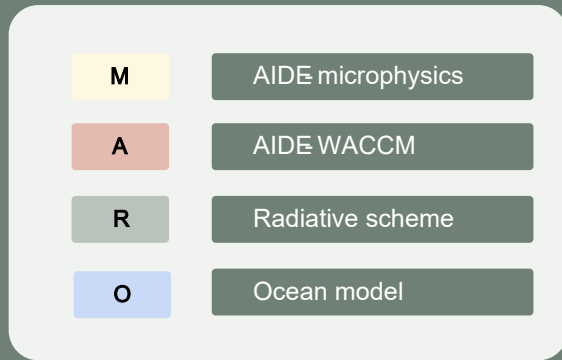
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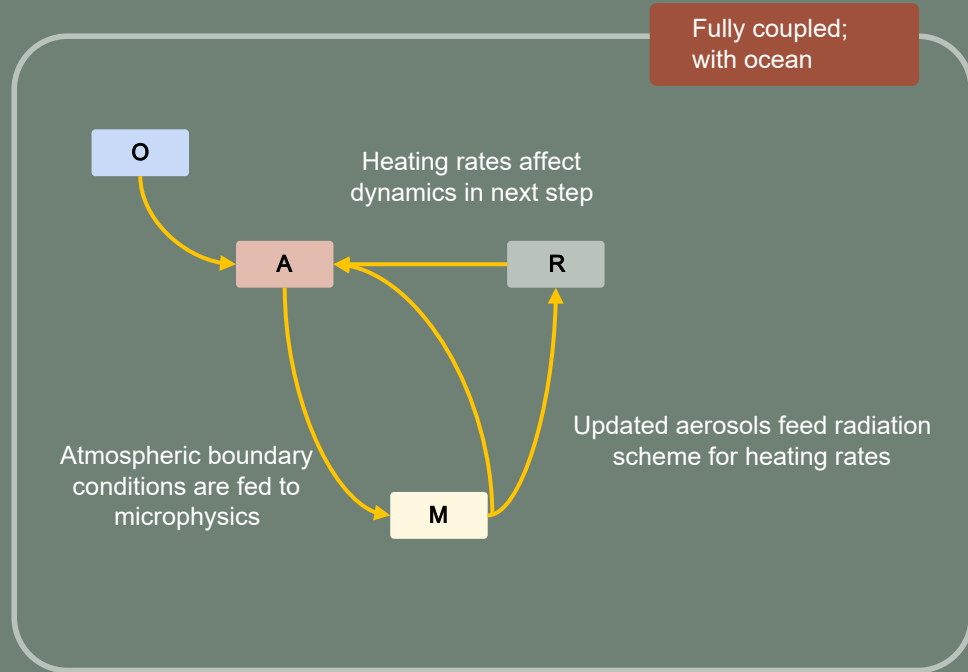
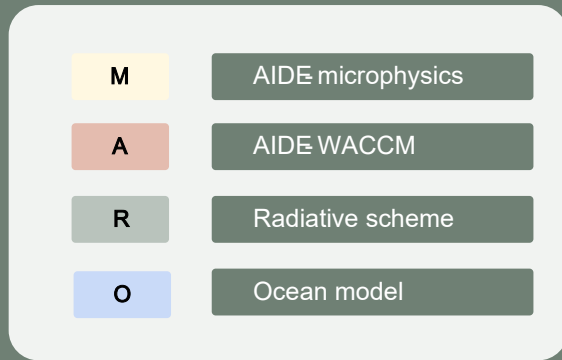
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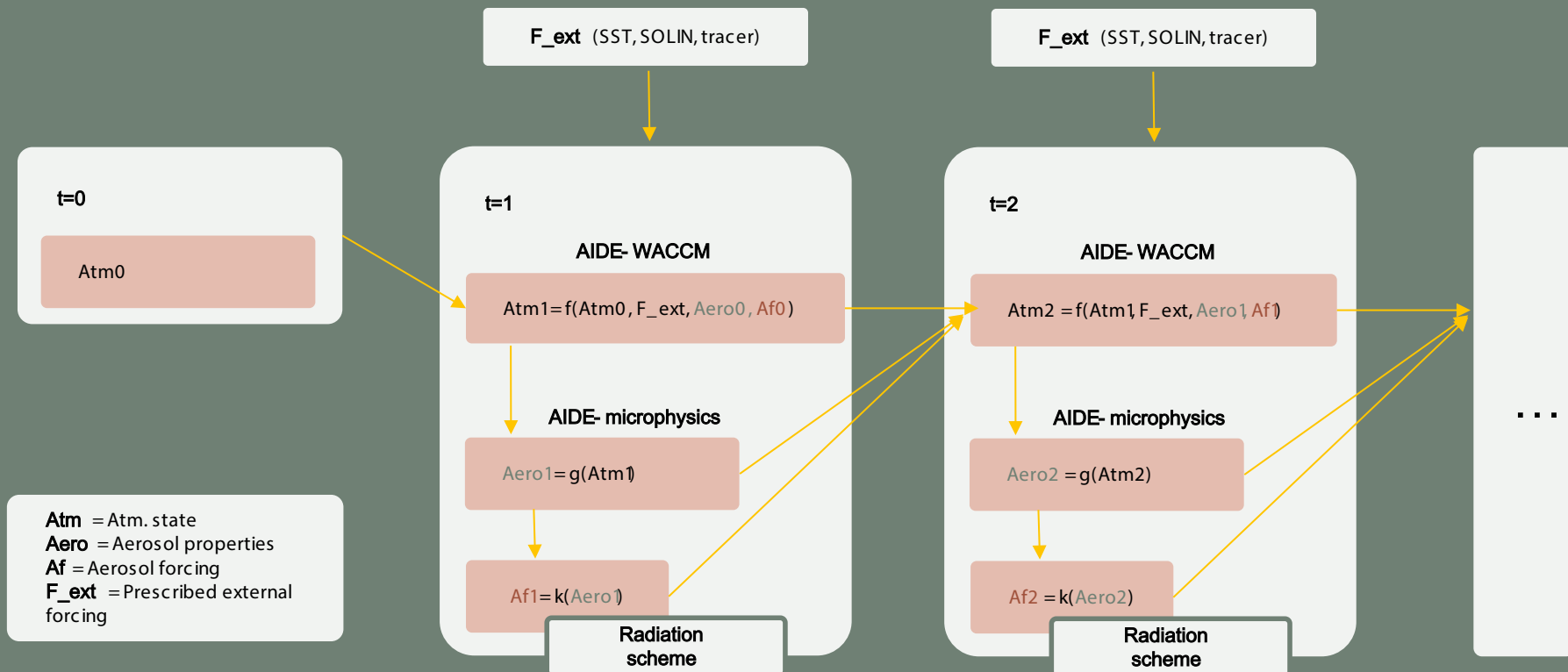
Coupling - how to couple?



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Coupling



Model setups needed for uncertainty analysis

Uncertainty	First pass	Second pass
Aerosol spatial distribution	A	
Strat. water vapor		A + M
Volc. eruptions during deployment	A	
Strat. ozone	A → M	A + M
Strat. transport feedback		
Ice sheets and glaciers		
AMOC	A	
Ocean carbon cycle		

Pinatubo Perturbed Parameter Ensemble (PPE) to validate CESM-WACCM microphysical response

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Vary **16 parameters** across 160 ensemble members

Pinatubo Perturbed Parameter Ensemble (PPE) to validate CESM- WACCM microphysical response

Identify those parameters that lead to the best agreement with observations regarding **lifetime and climate impact of Mt. Pinatubo**

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Injection Parameters (5)

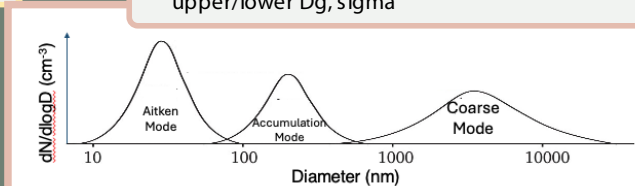
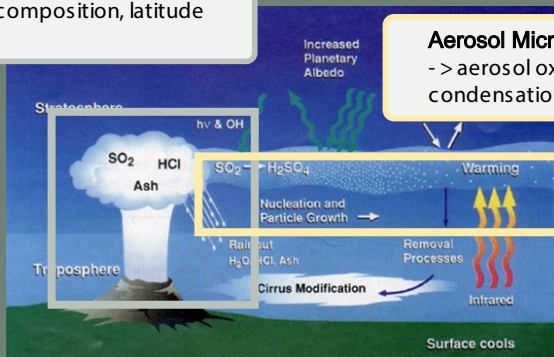
-> injection height, composition, latitude spread, mass

Aerosol Microphysics (4)

-> aerosol oxidation, nucleation, condensation, sedimentation

Modal Aerosol Structure in MAM4 (7)

-> Aitken, accumulation and coarse mode, upper/lower Dg, sigma



Timmreck et al. 2018; McCormick et al., 1995 (volc. figure)



Who are we

www.reflective.org

Facilitate Stratospheric Aerosol Injection (SAI) research

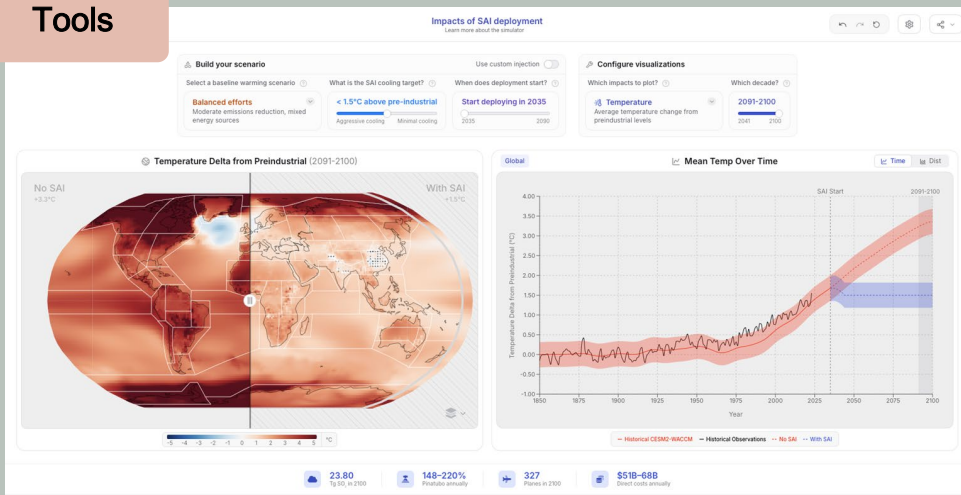


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Tools

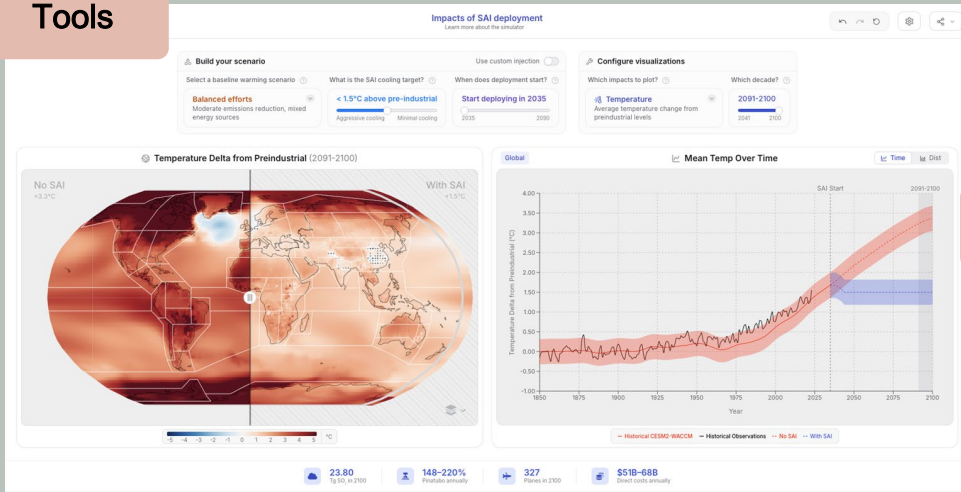




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Tools



Resources

ReflectiveCloud

A JupyterHub cloud resource for the SRM research community, managed by Reflective

README.md

Welcome to the Reflective Cloud

A community hub for open-source and reproducible SRM research. Being a member of this organization gives you access to the Jupyter hub at <https://reflective-212c.cloud/>

This is a community resource. Start conversations or ask questions via the discussions tab on this page. You can also make repositories under this page to share code, make tutorials, make reproducible figures for your papers etc.

Want to join the org and get access to the cloud hub, fill in the form here: [hub access](#)

Popular repositories

Book Forked from glensclaffey/GeoCloud Public [github](#) Public

Jupyter Notebook 1

reflective_cmip6_geomip_ingestion GeoMIP dataset ingestion Public

Jupyter Notebook

People

Discussions are for sharing announcements, creating conversation in your community, answering questions, and more.

Top languages

Jupyter Notebook HTML



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AIDE- SAI → Tool to systematically analyse modeling uncertainties related to SAI

Susanne Baur¹, **Ali Akherati**¹, **Hunter Brown**⁵, **Dakota Gruene**¹, **Emily Kuh**¹, **Marianna Lin**^{2,3}, **John Orcutt**¹,
Daniele Visoni^{1,2}, **Duncan Watson**, **Parris**^{1,4}

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Hunter

Mt. Pinatubo PPE

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Ali

AIDE microphysics



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AIDE WACCM

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Ali

AIDE microphysics



Hunter

Mt. Pinatubo PPE



Susanne

AIDE WACCM



He's here too

Dan

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