

Predicting trend errors in the presence of data gaps

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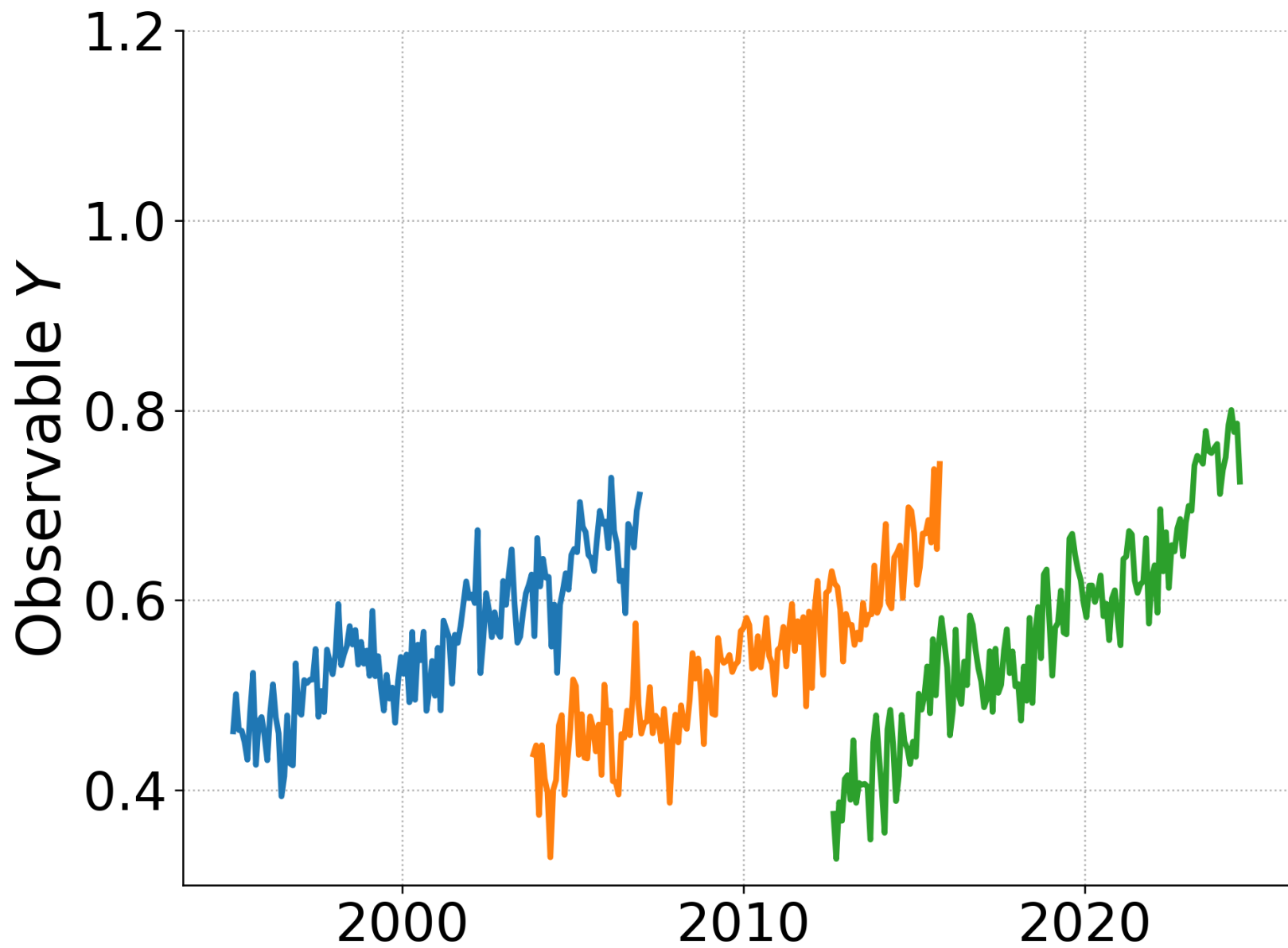
Image source: Google Gemini

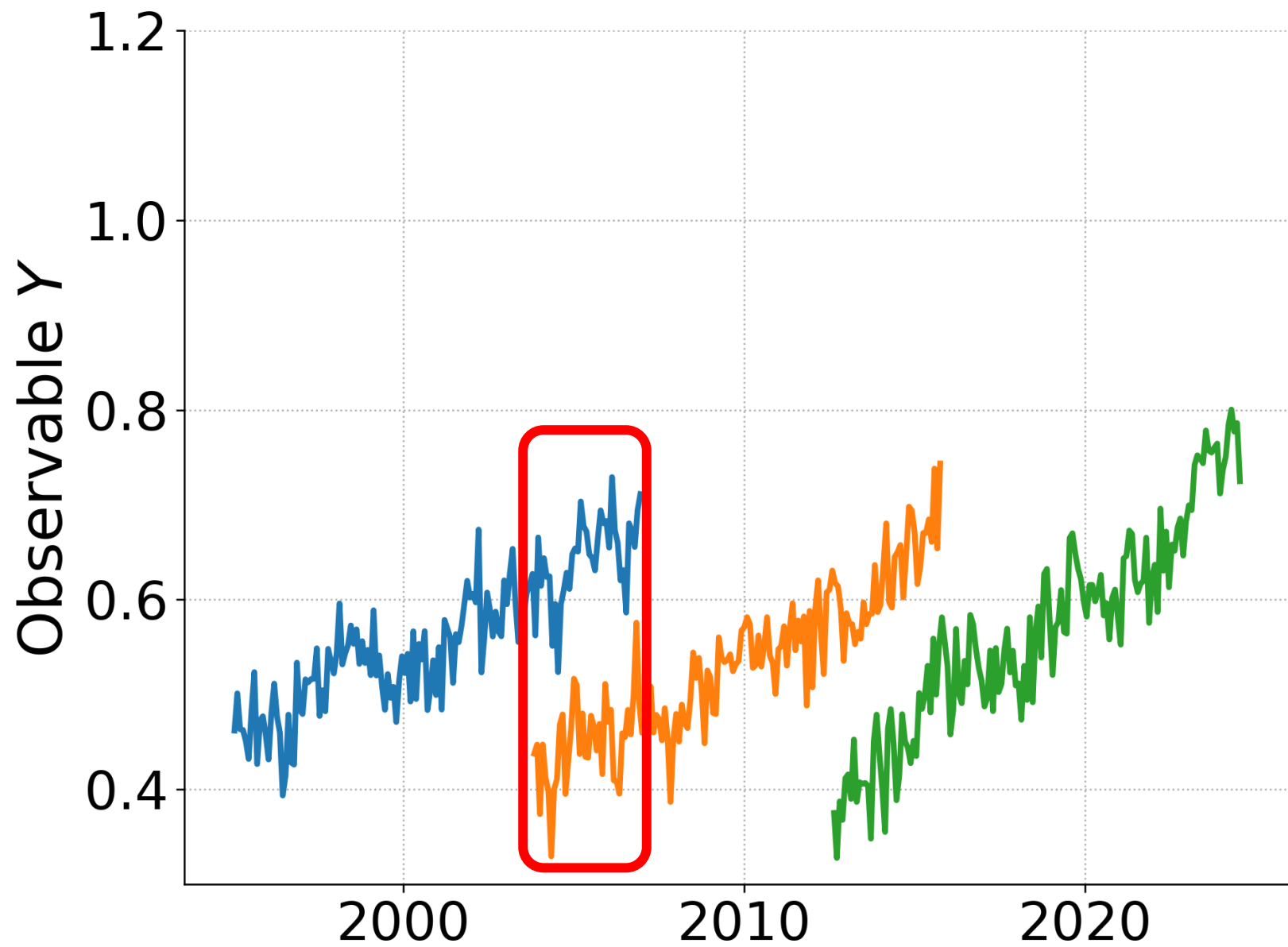
Libera is on its way!

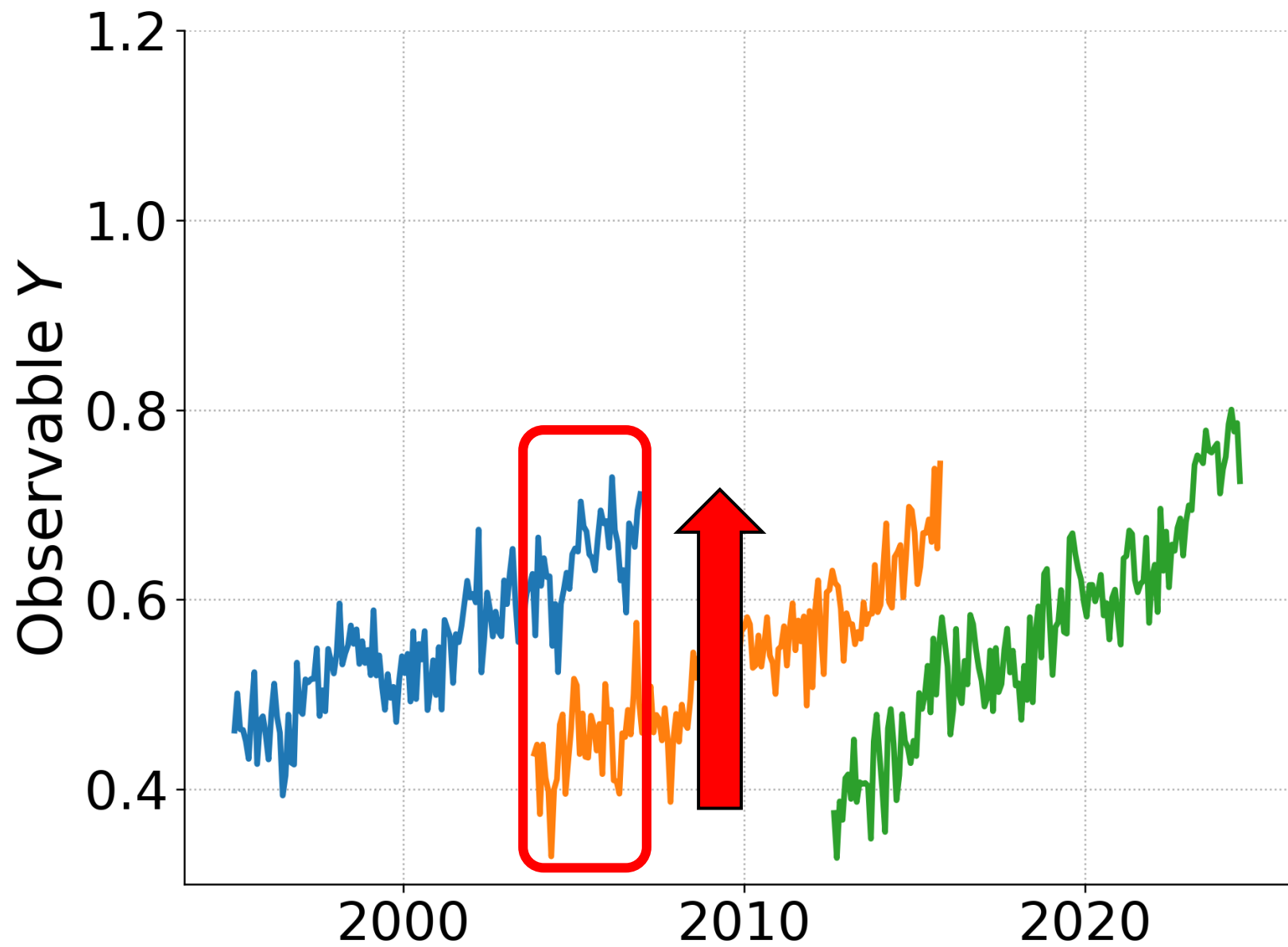


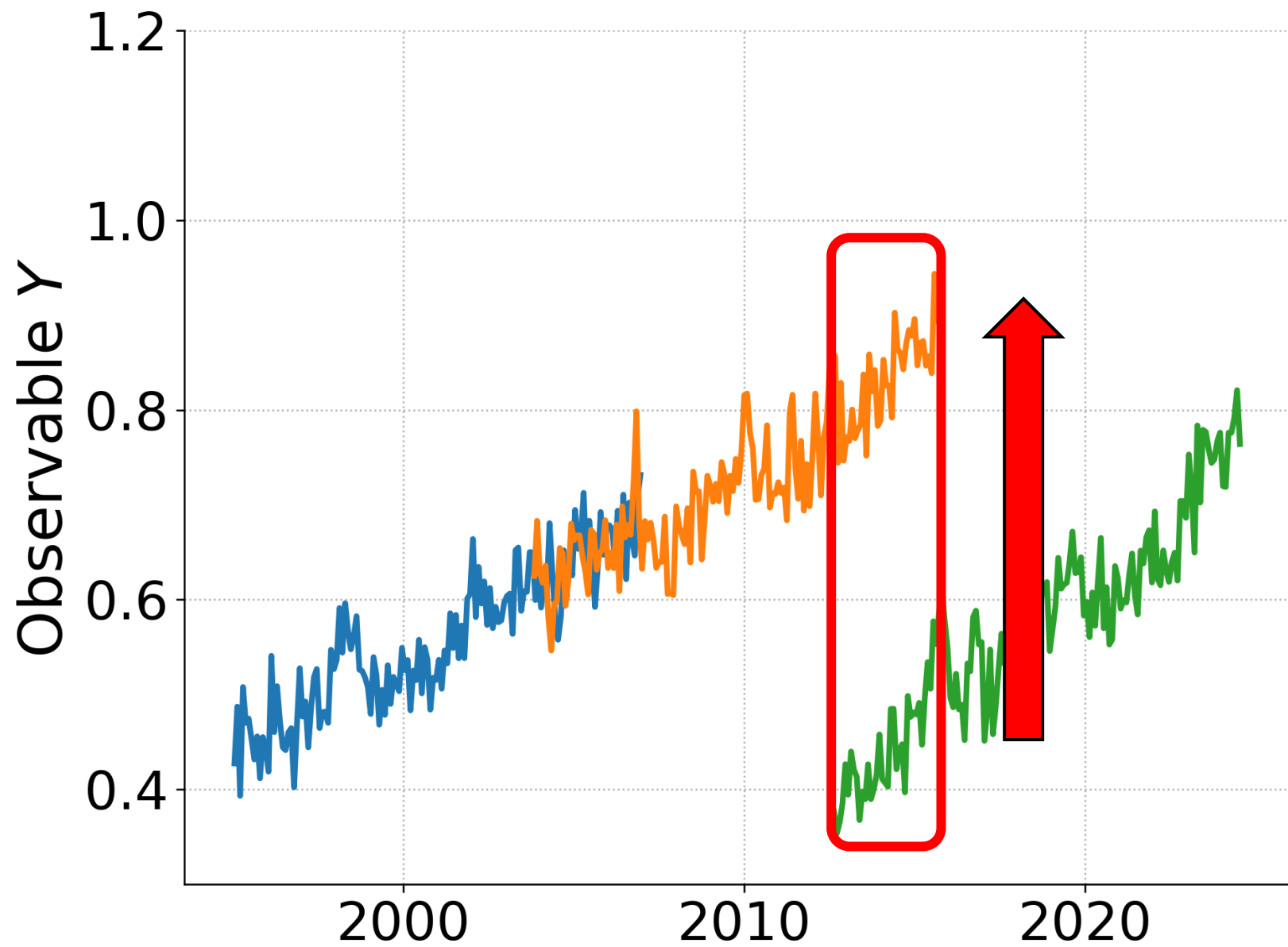


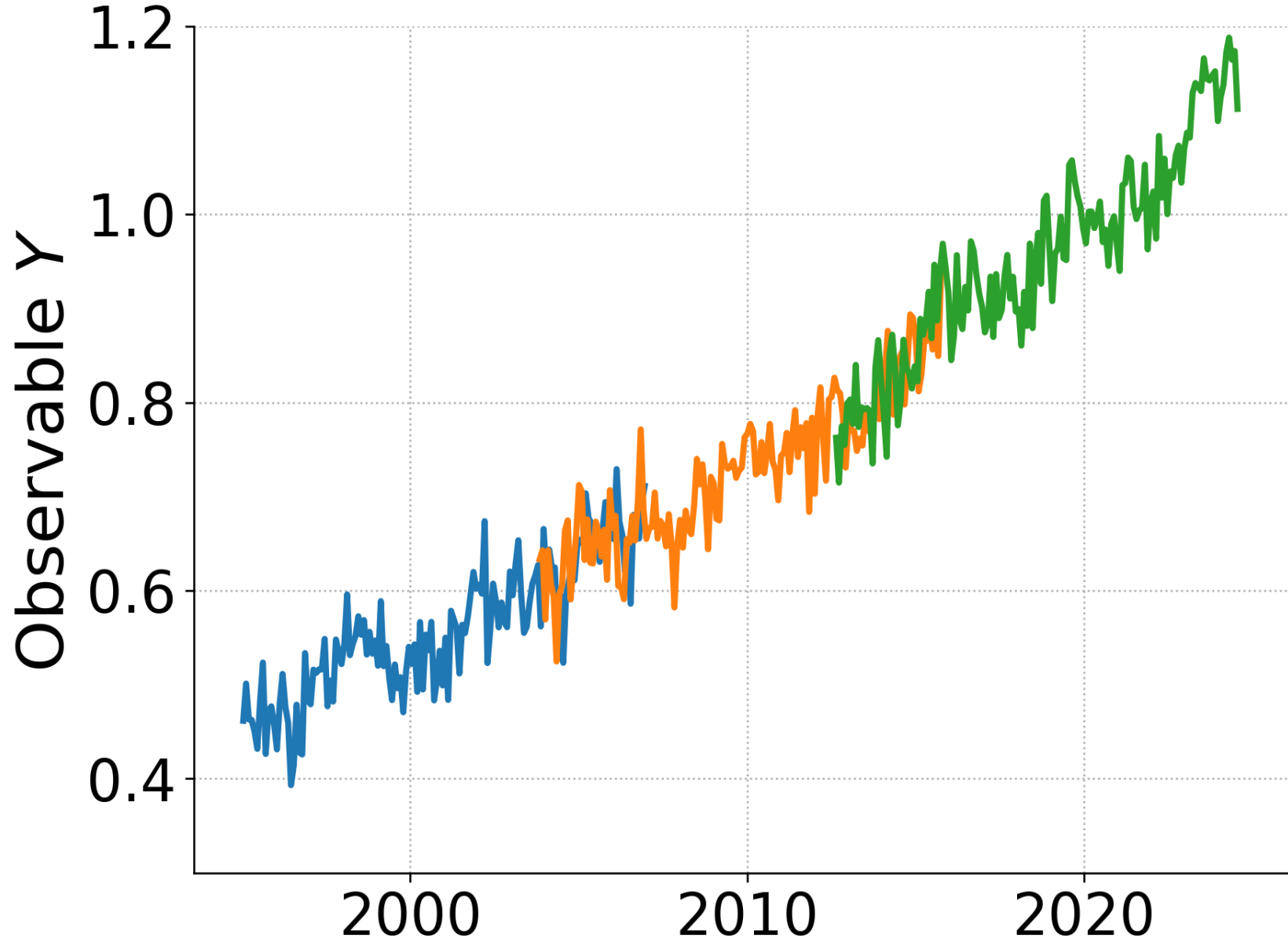
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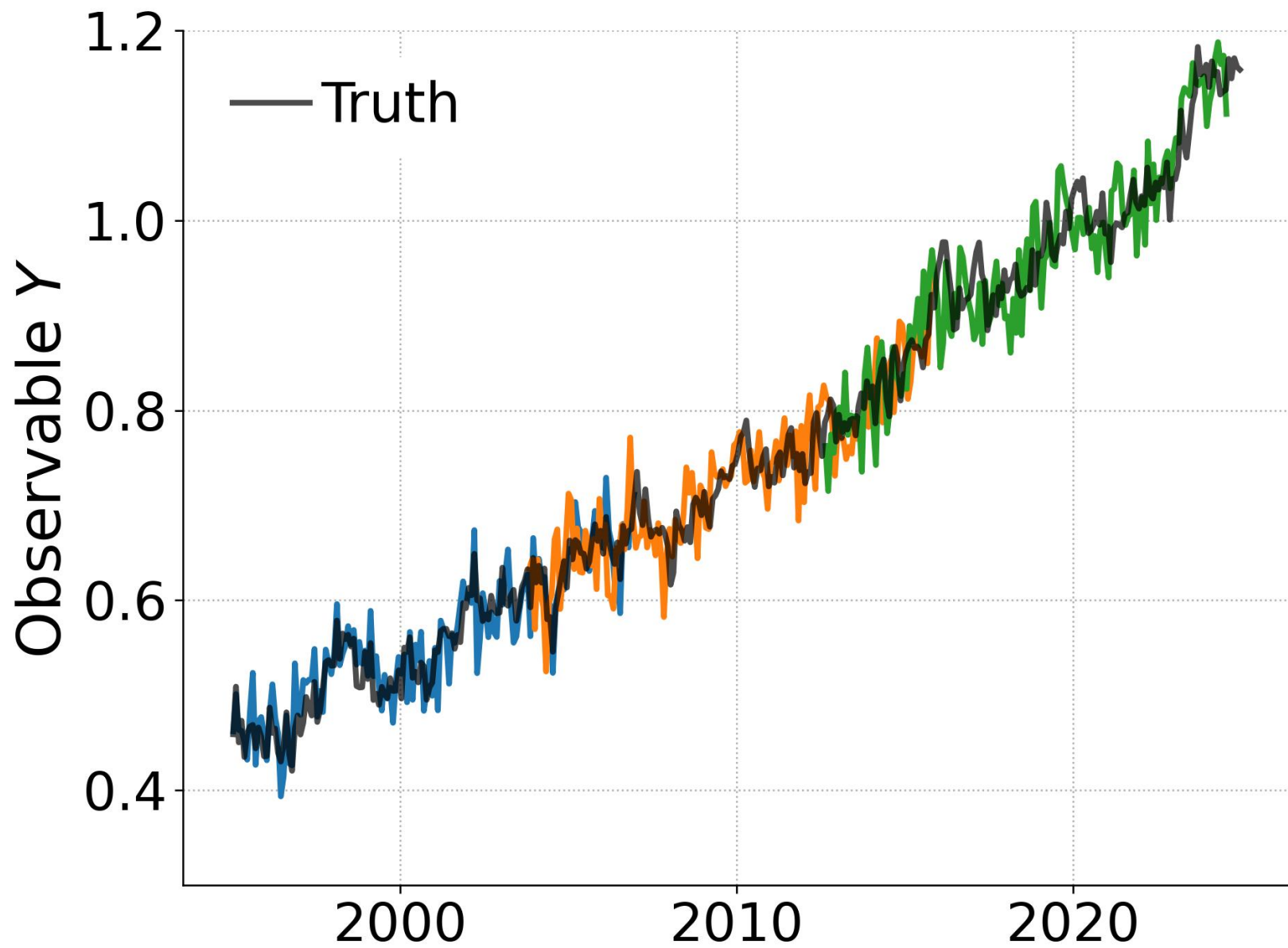






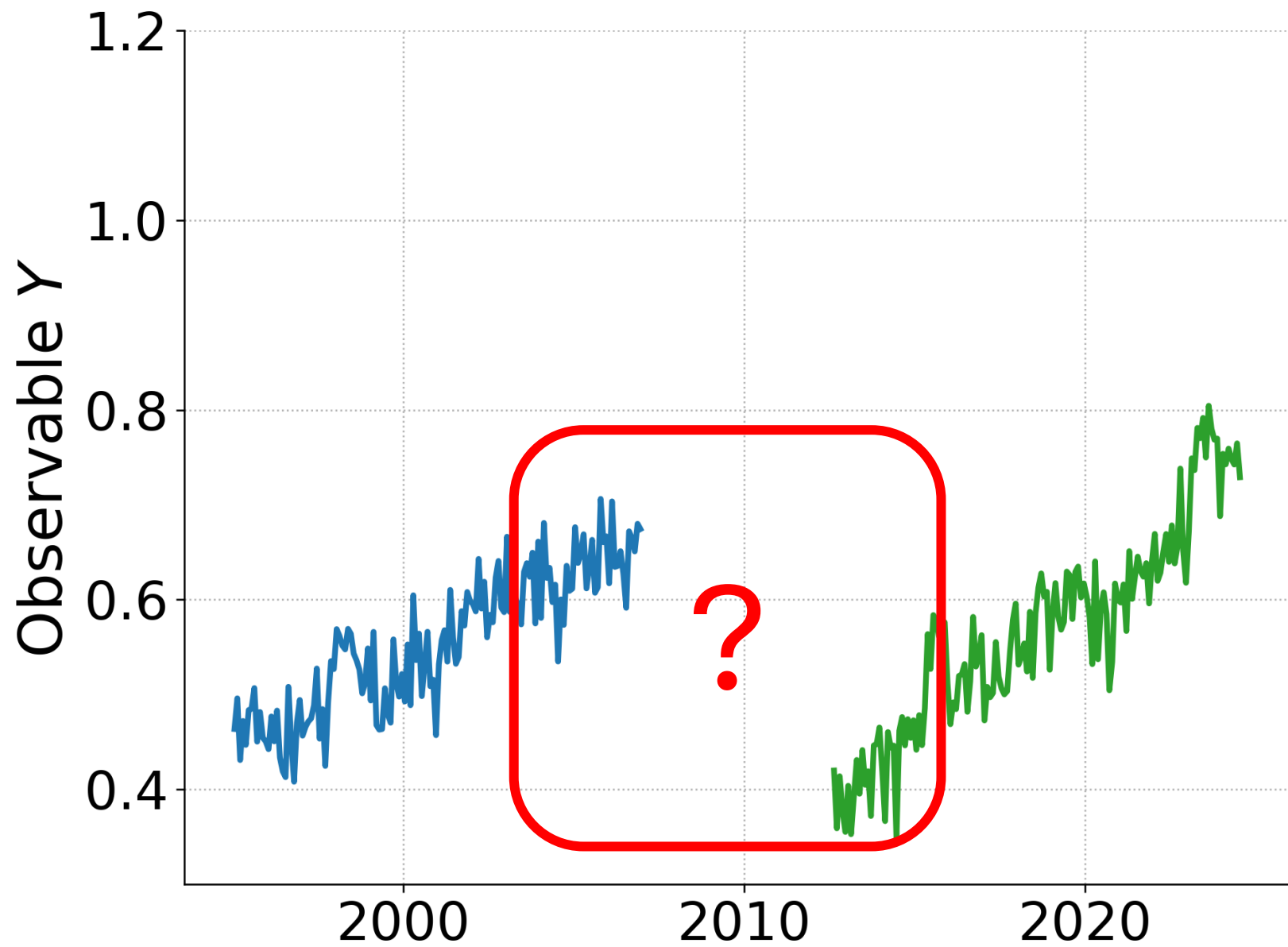






But what if...





Examples

ICESat gap:
\$15m/year to bridge ICESat gap
According to MacGregor et al.
(2021)*



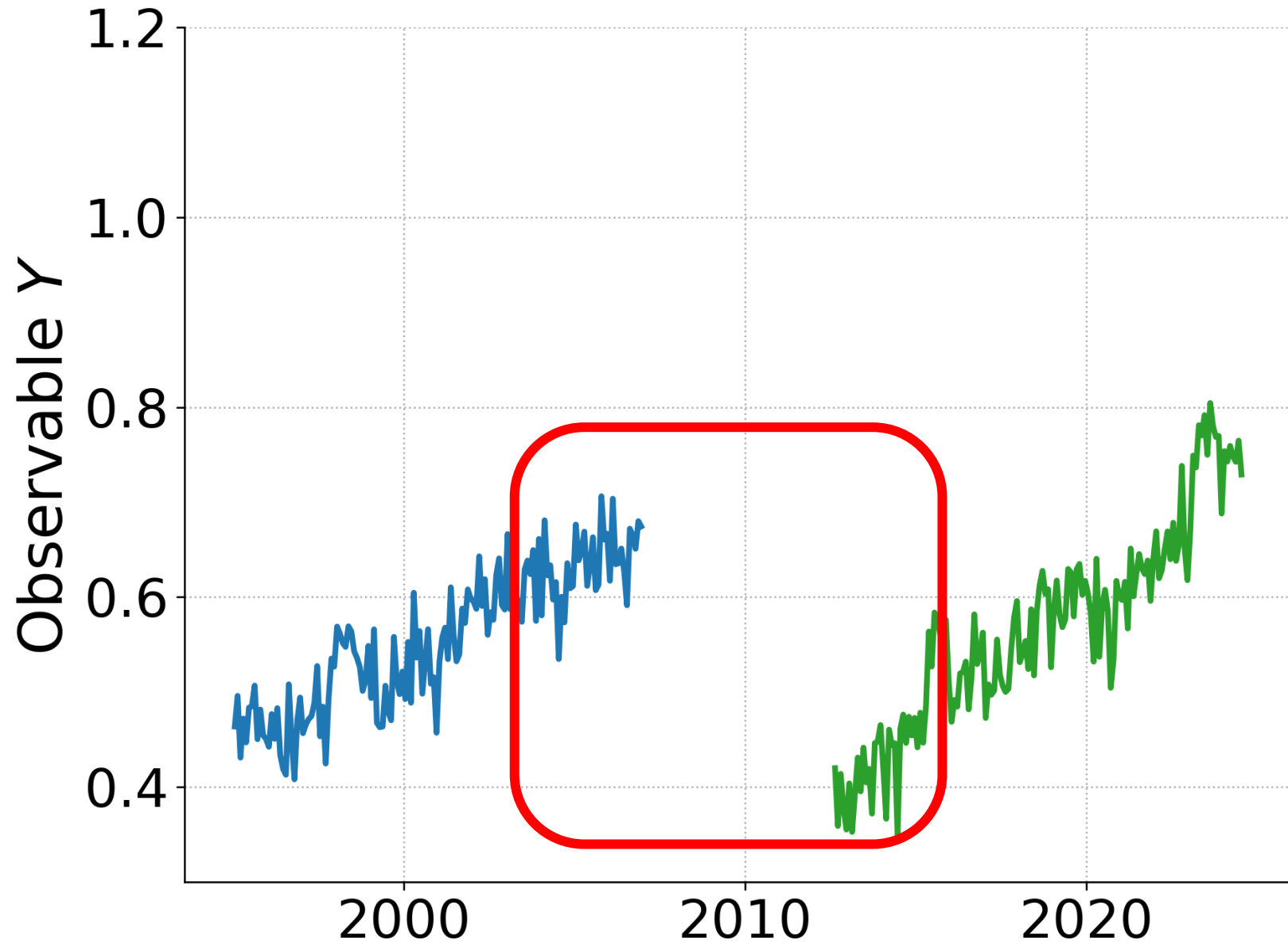
Image source: NASA

ACRIM gap:
20+ years of scientific disagreement

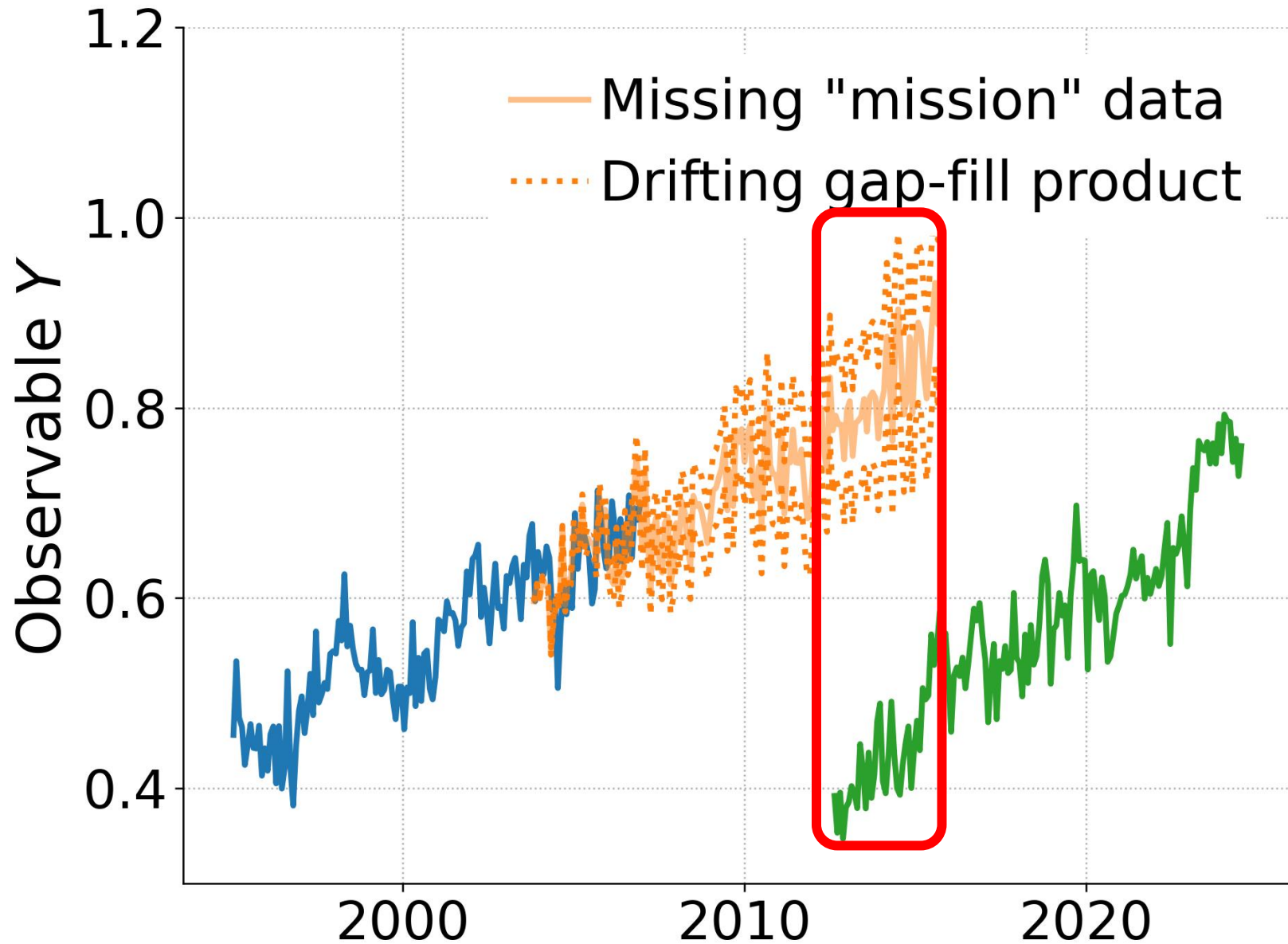
A screenshot of a web page from The Royal Society Publishing. The page features the Royal Society logo and the title 'PROCEEDINGS A'. Below the header, it displays 'Volume 464, Issue 2094' and 'June 2008'. The main content area shows a research article titled 'Recent oppositely directed trends in solar climate forcings and the global mean surface air temperature. II. Different reconstructions of the total solar irradiance variation and dependence on response time scale'. The authors listed are Mike Lockwood and Claus Fröhlich. The page includes a cover image of the journal, a search bar, and navigation links for 'Previous Article' and 'Next Article'. At the bottom, there are icons for 'Split-Screen', 'Views', 'PDF', 'EPUB | PDF', 'Share', and 'Cite', along with a 'Tools' dropdown menu.

*"part of its budget came from the American Recovery and Reinvestment Act of 2009, which ultimately set OIB [Operation Ice Bridge]'s budget at ~\$15M per year." doi: 10.1029/2020RG000712

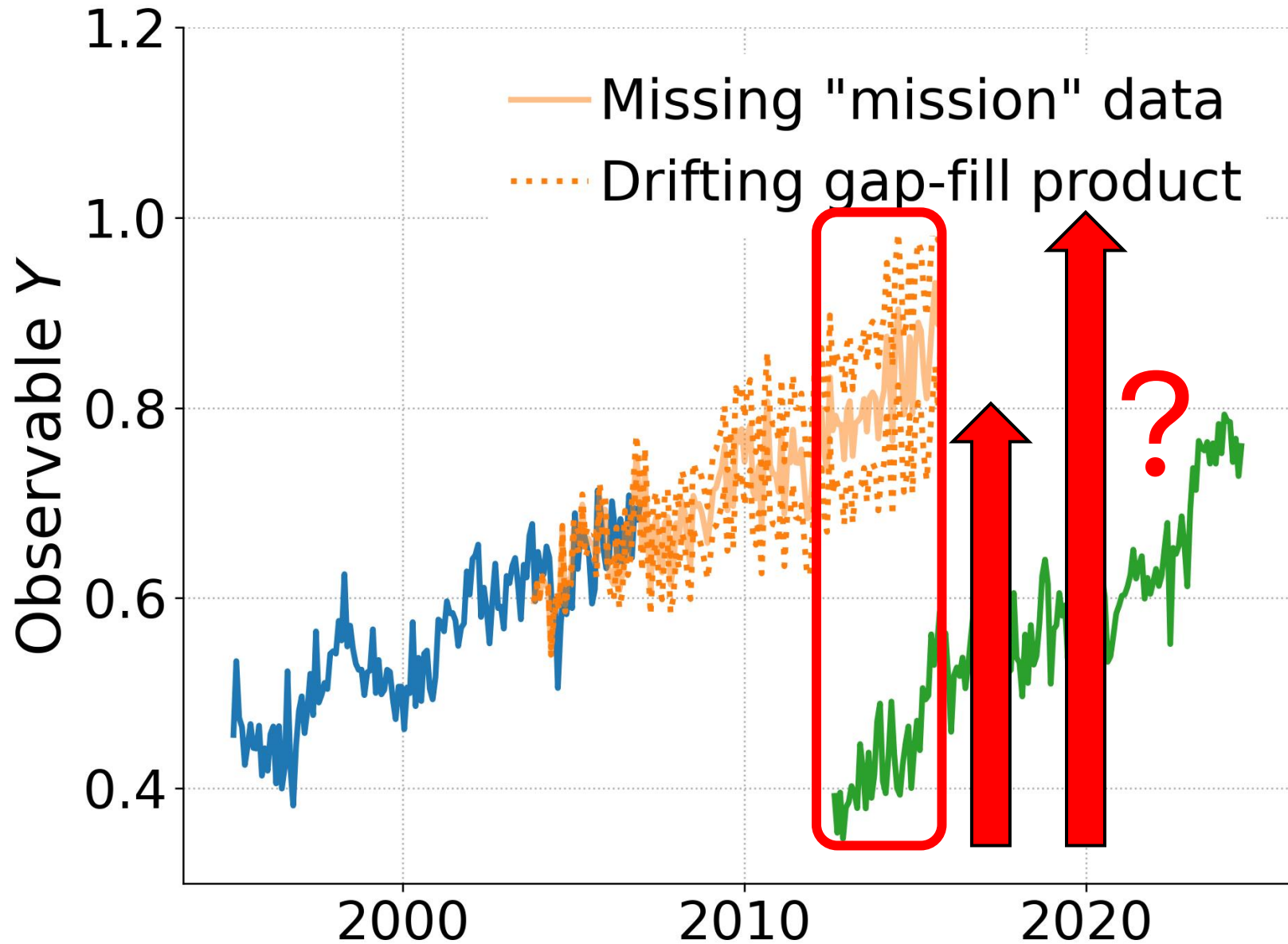
What if we fill the gap with data with more “drift”



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What can we do?



Image source: David C. Bowman NASA, Langley

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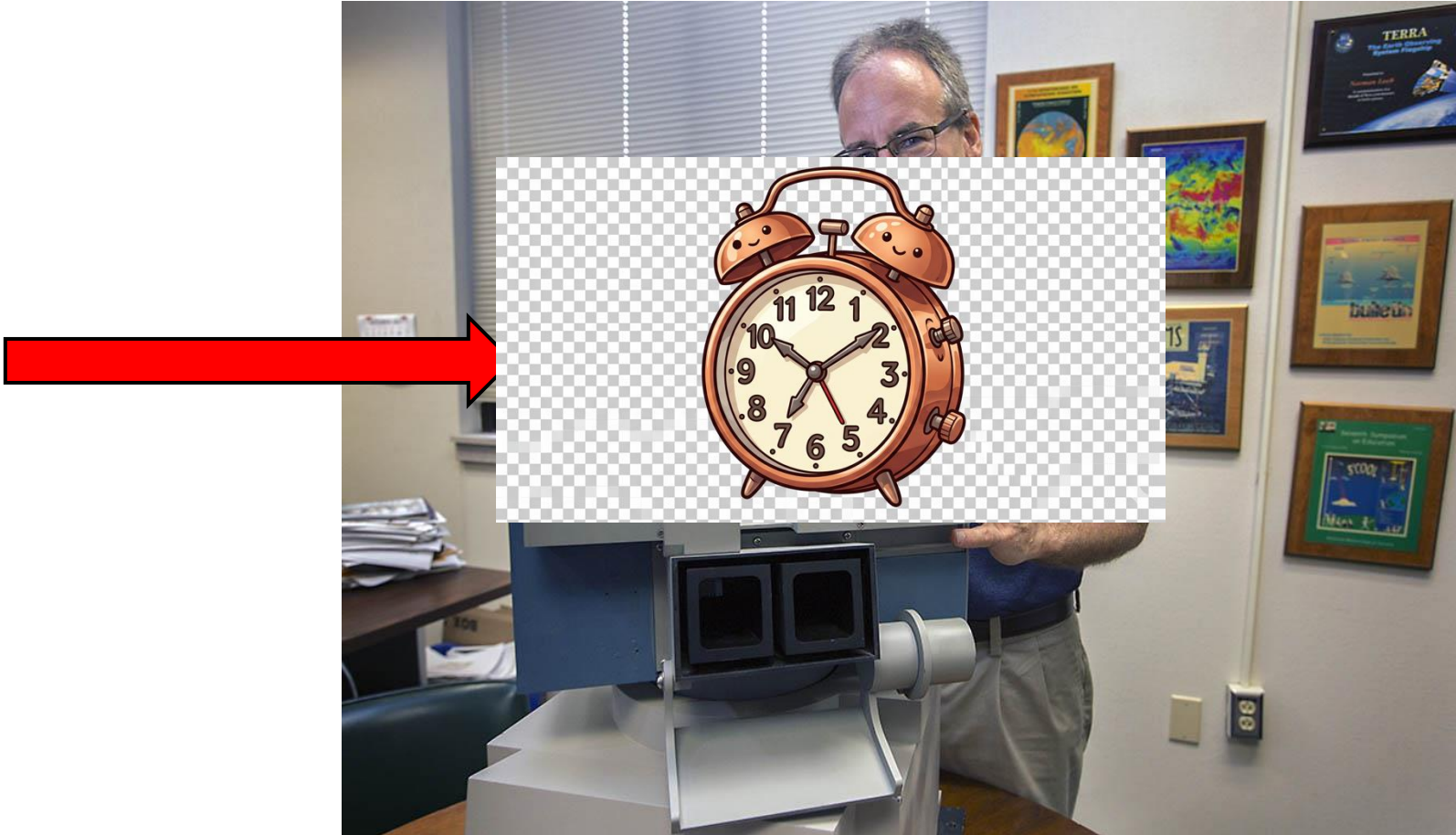


Image source: David C. Bowman NASA, Langley

Continuity in Top-of-Atmosphere Earth Radiation Budget Observations

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AND JOSHUA C. WILKINS^c

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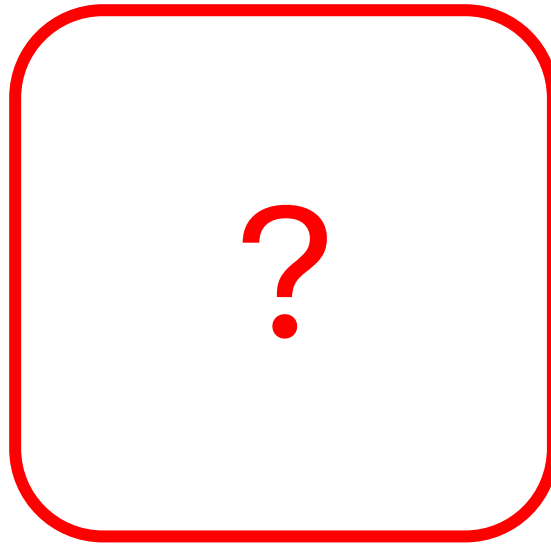
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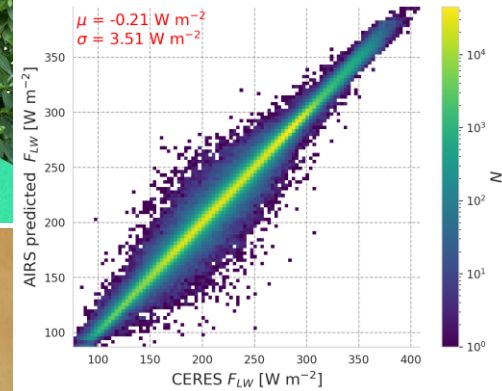
Bridging a data gap using computed TOA fluxes from one satellite product and one atmospheric reanalysis results in errors that are a factor of 4 larger than those obtained when there is overlap between successive missions.

What can we do?



JPL

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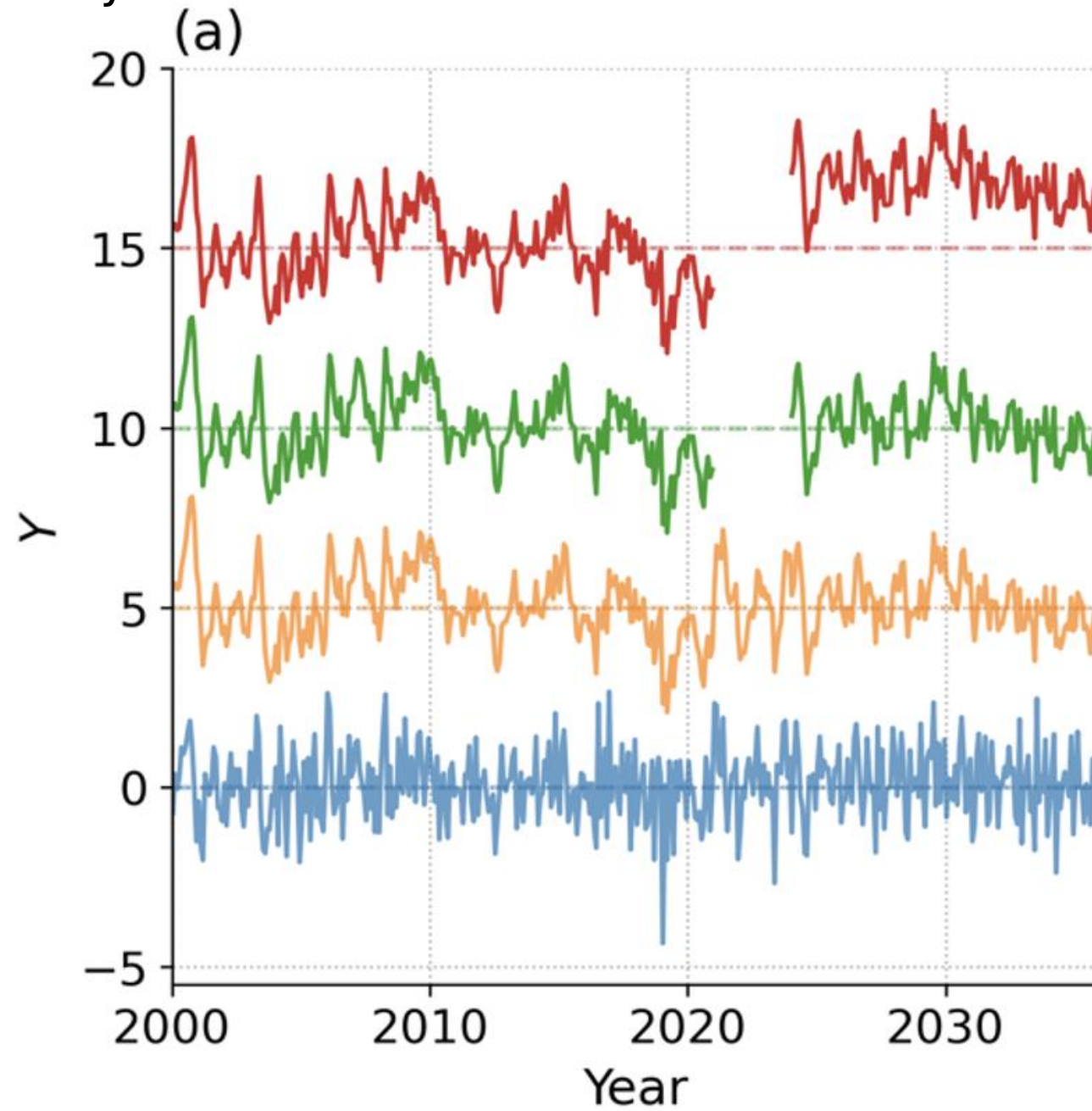
Two factors of a gap are:

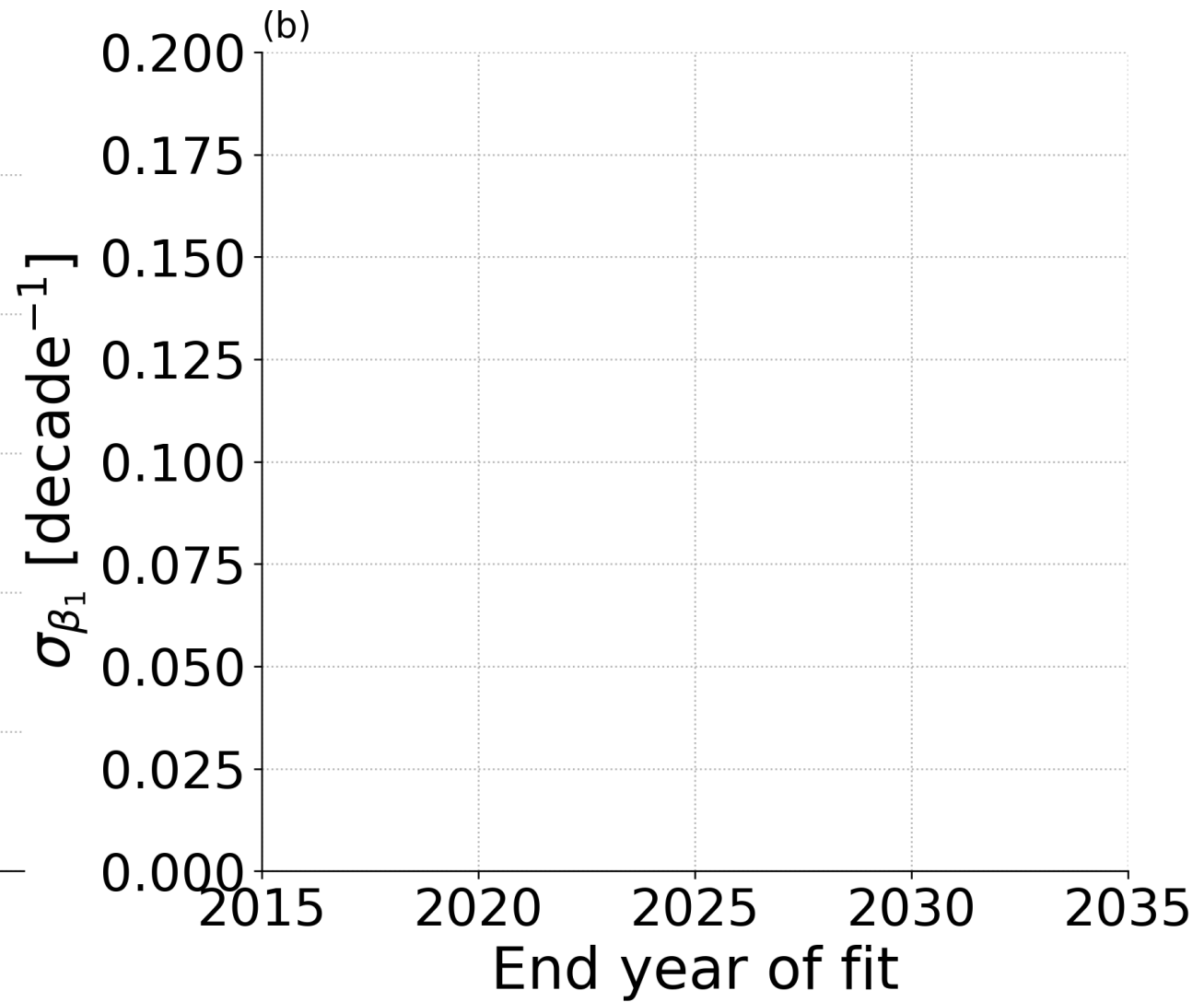
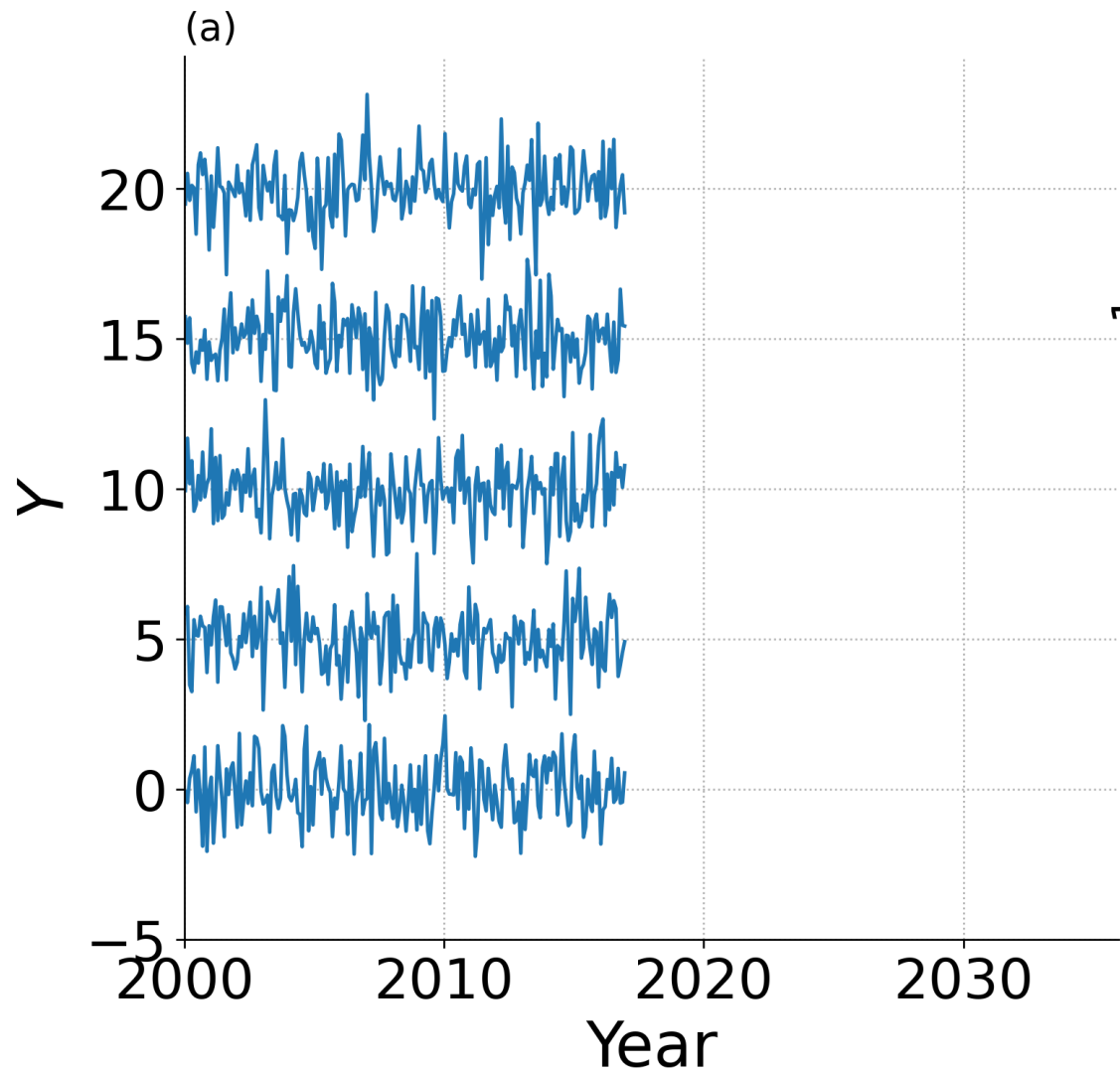
1. How long is the gap? Δt
2. How big is the error? $\sigma_{\Delta Y}$

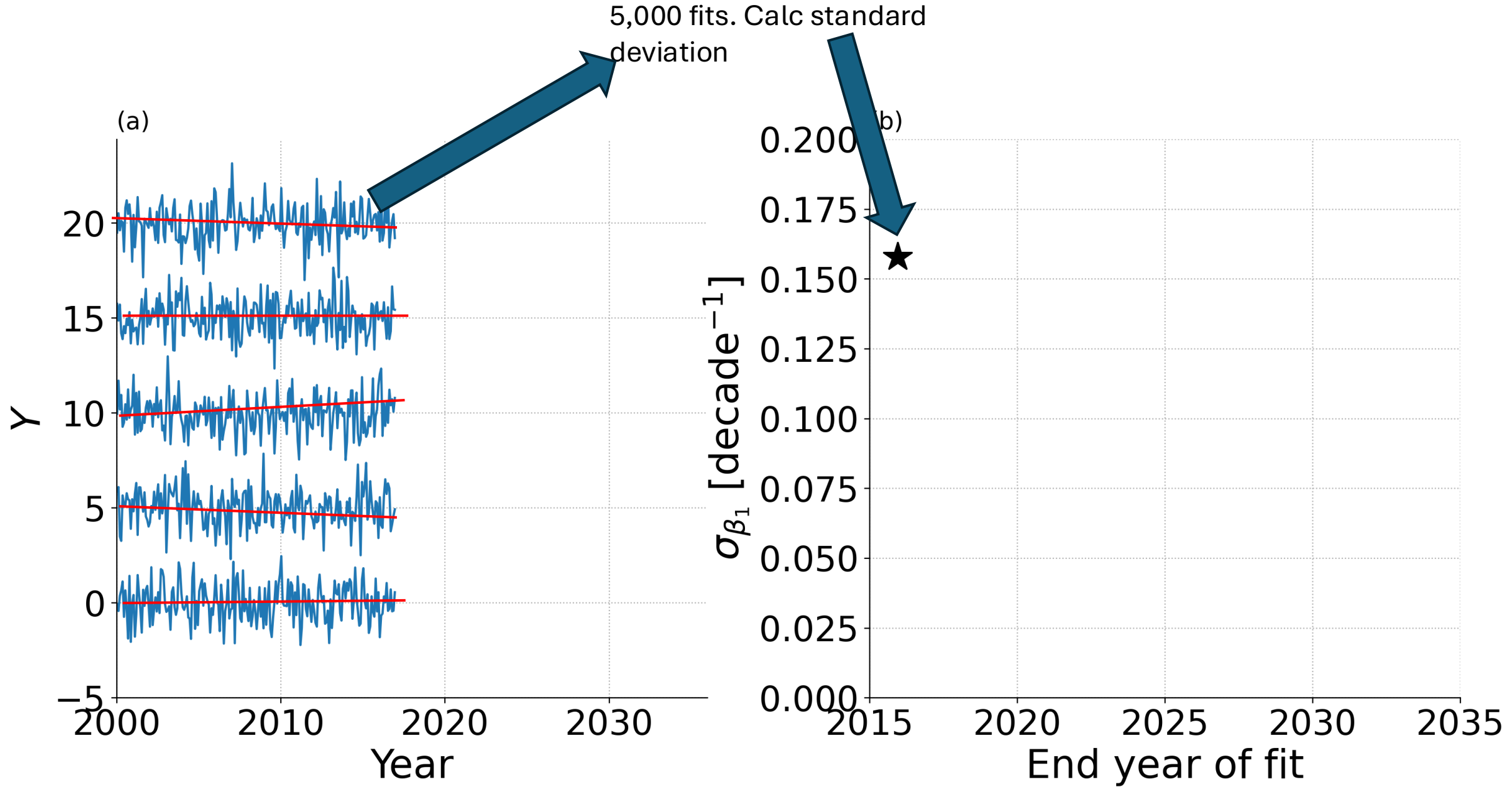
Questions:

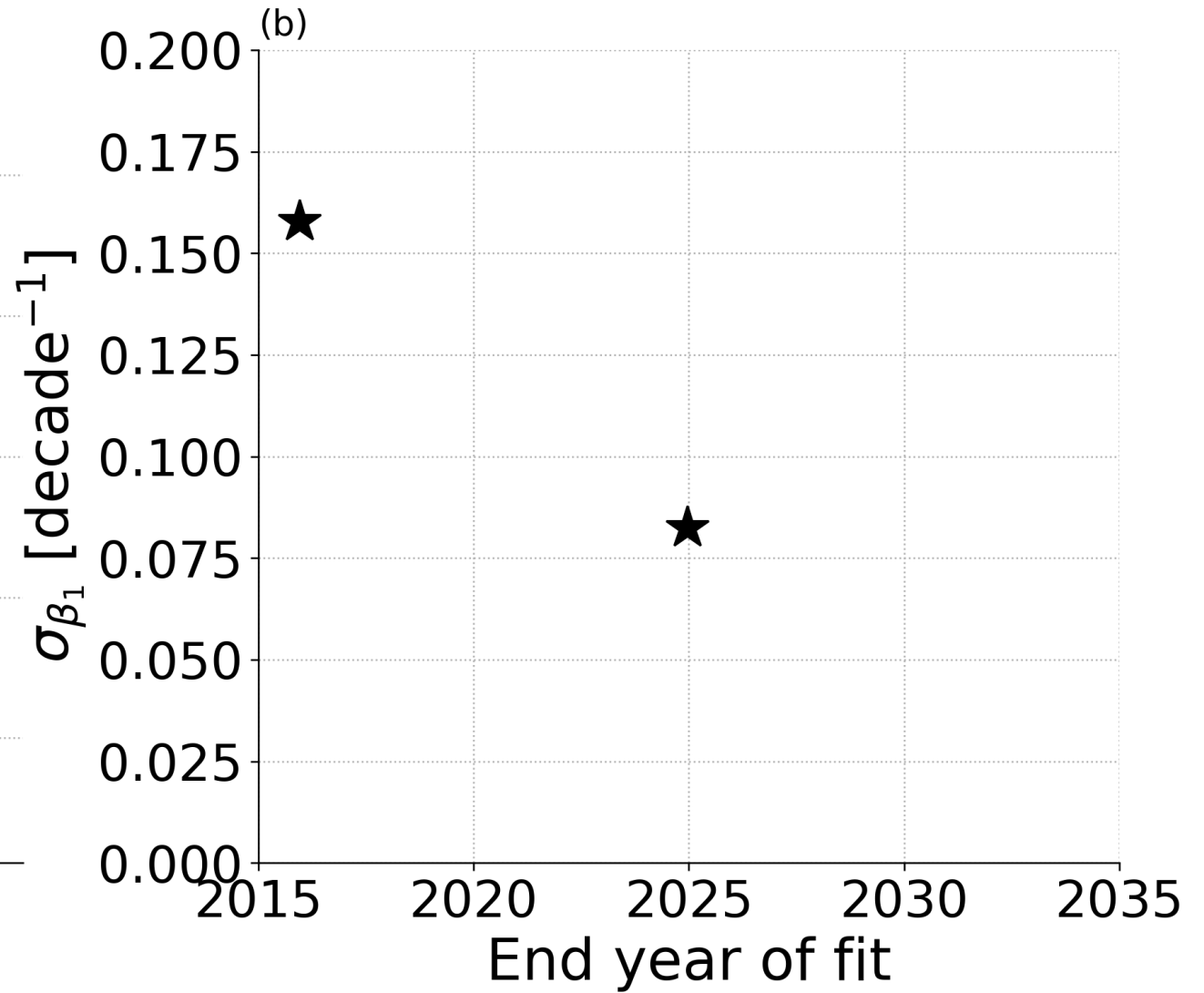
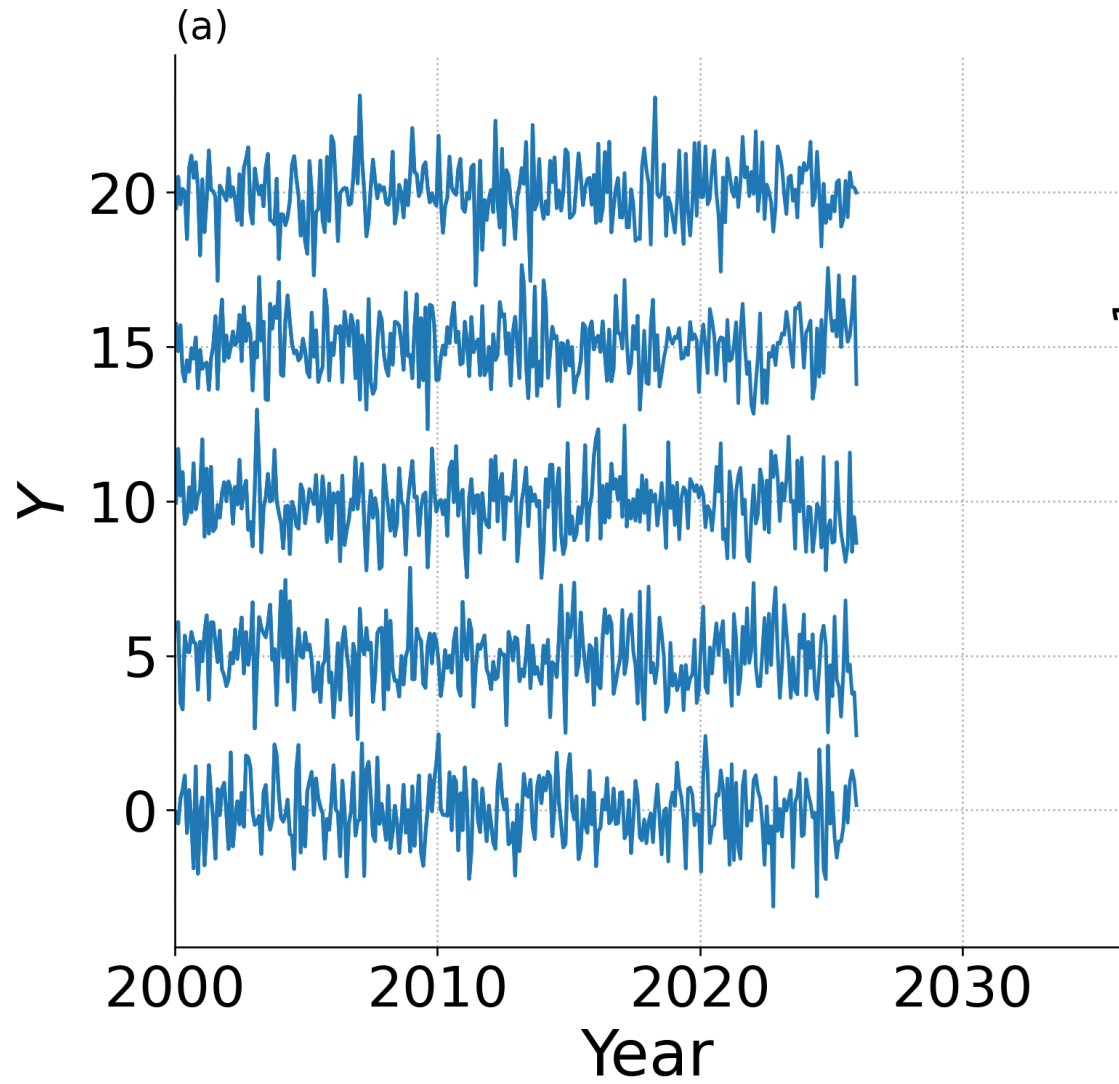
1. How do gap size Δt and error $\sigma_{\Delta Y}$ affect trend uncertainty?
2. Can we predict this ahead of time, and thus estimate scientific value of efforts to change Δt are $\sigma_{\Delta Y}$

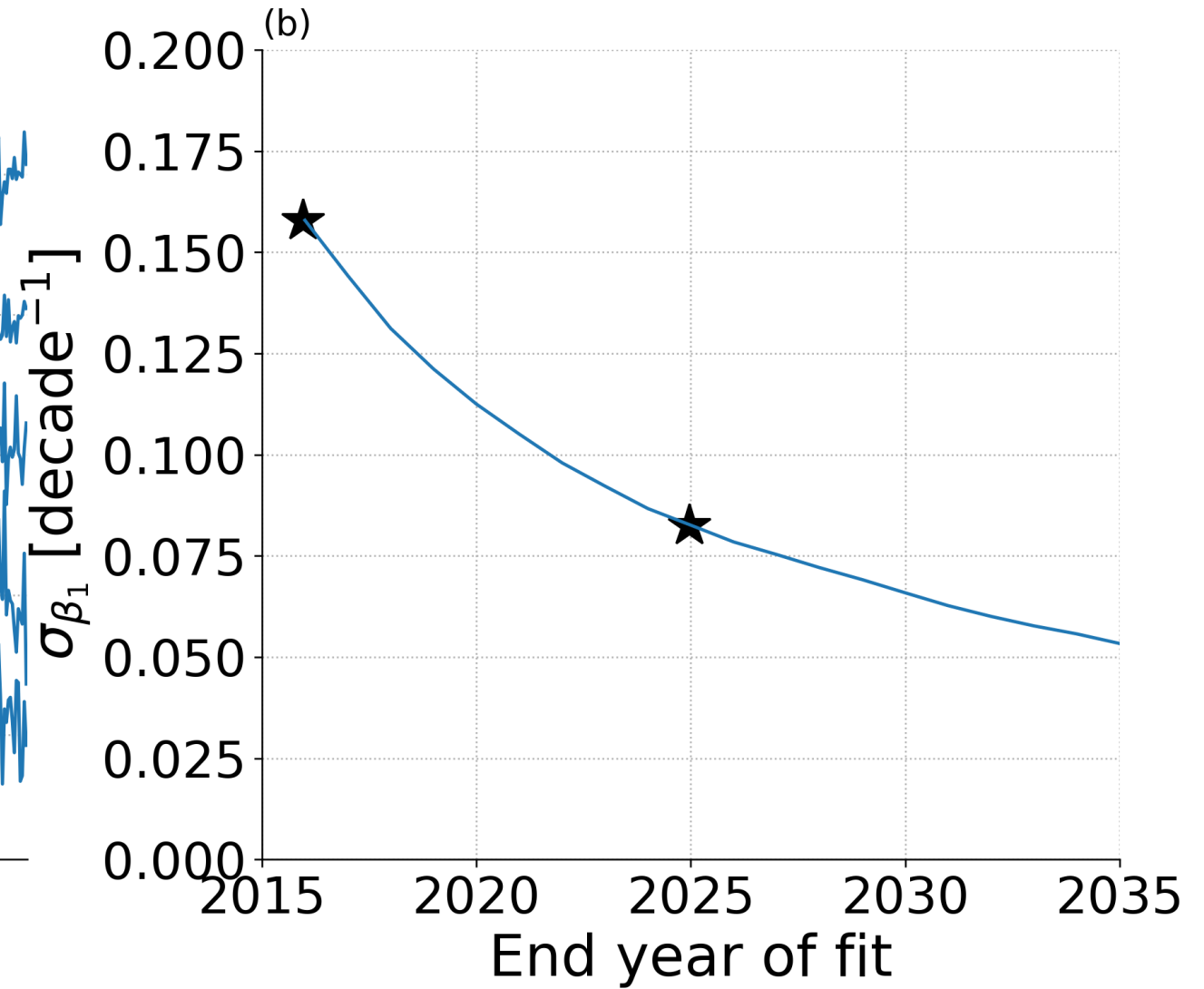
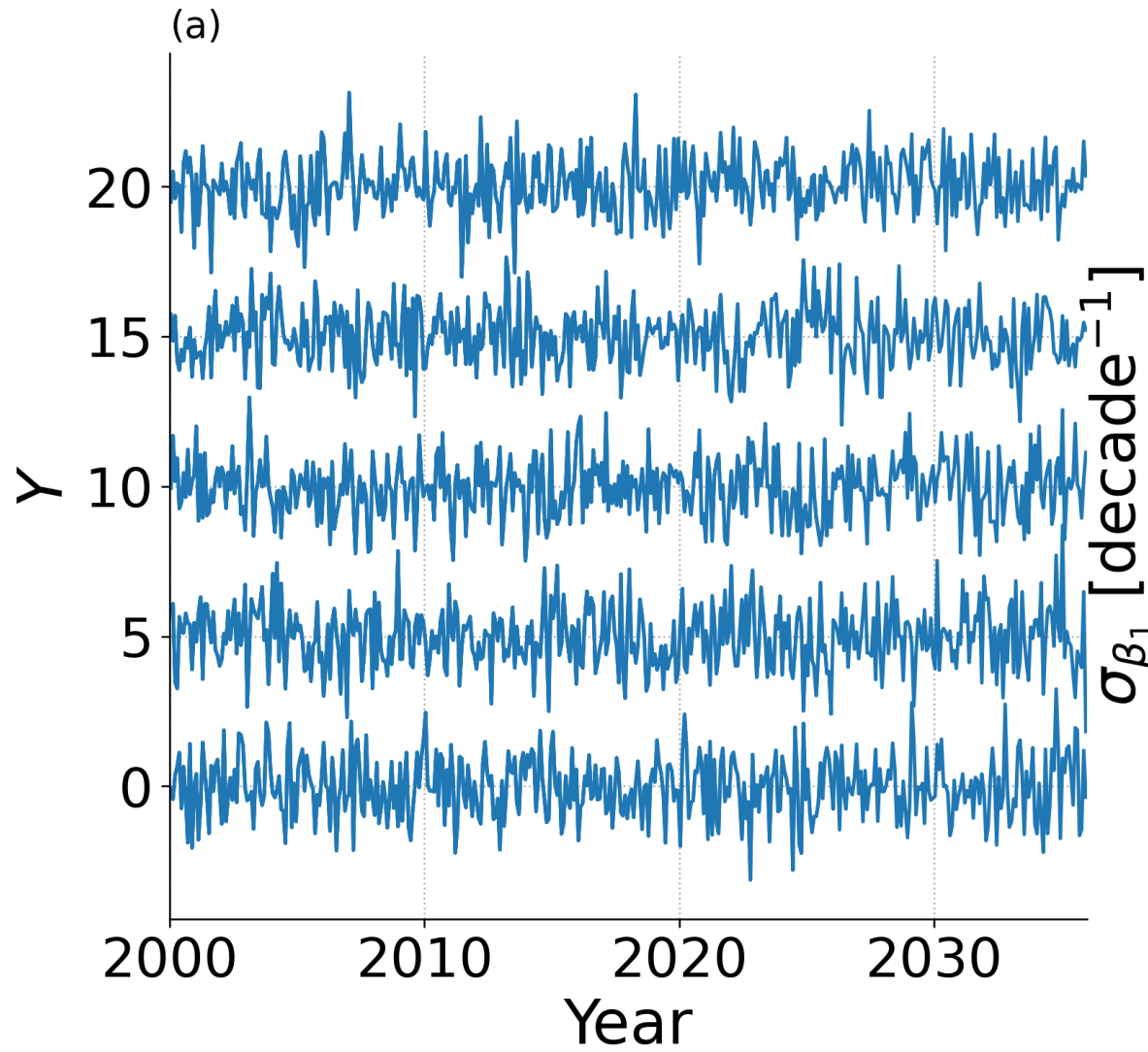
We can imagine many scenarios:



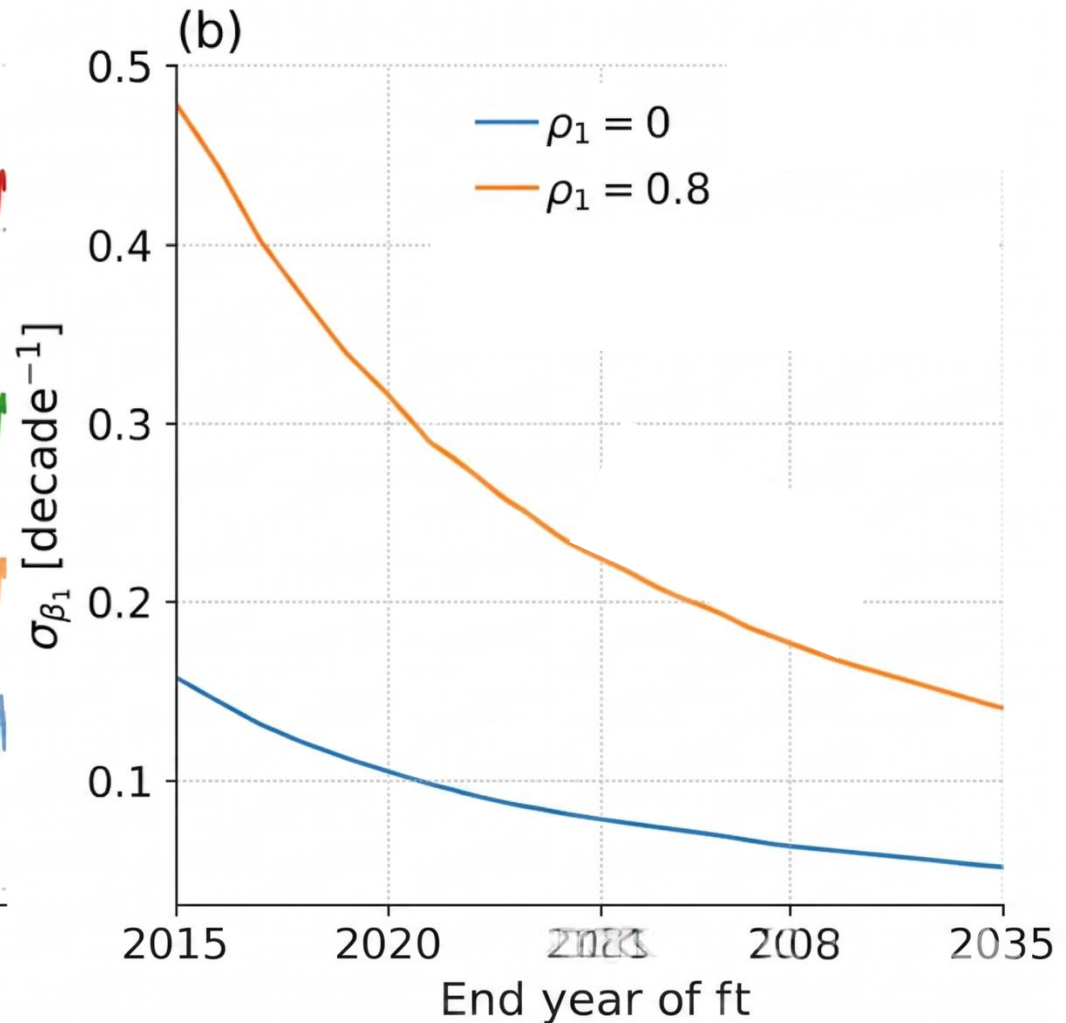
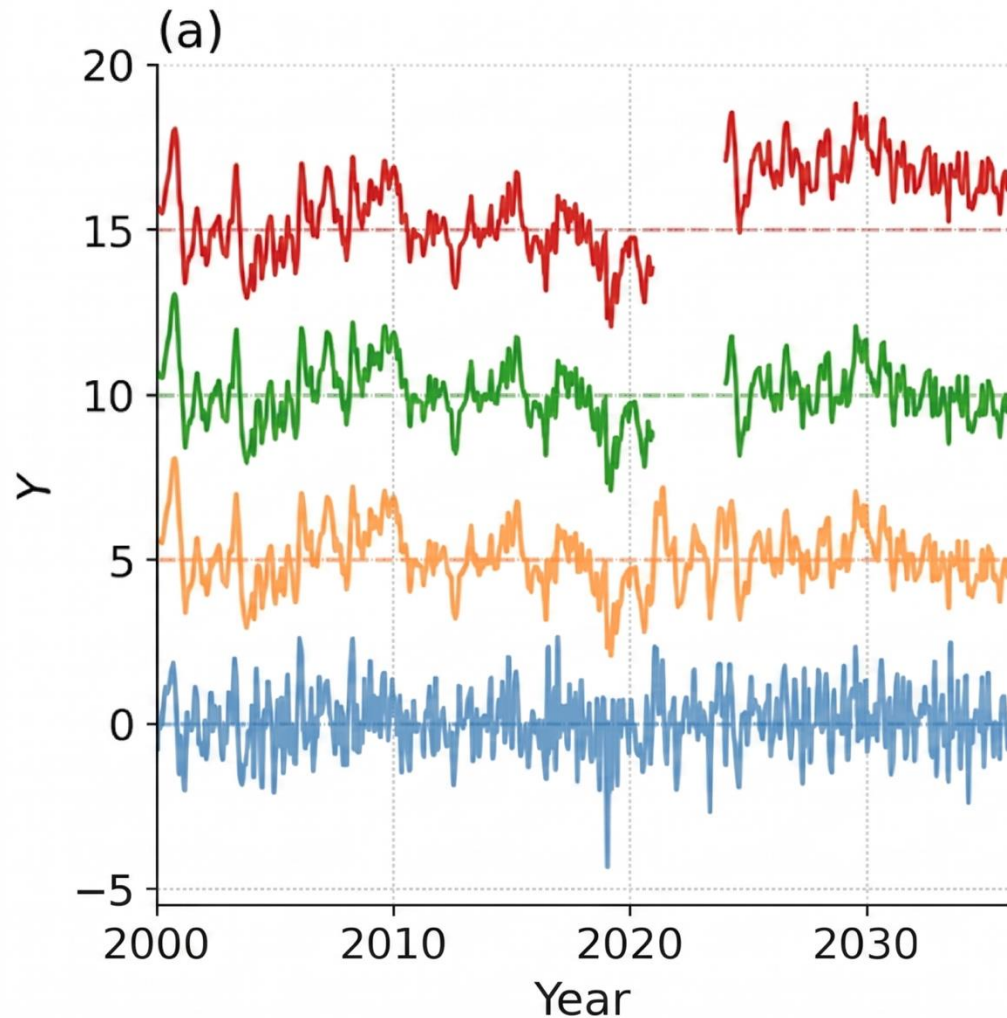




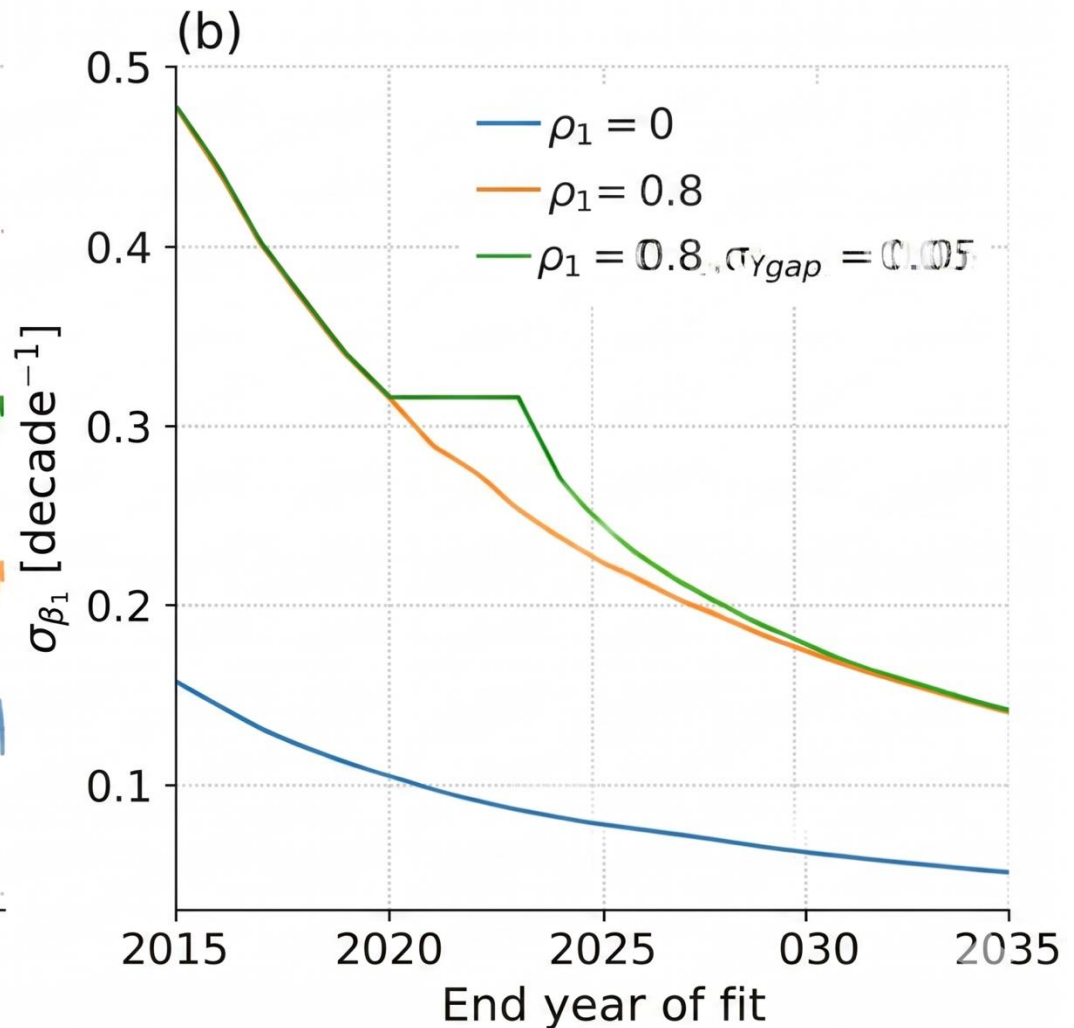
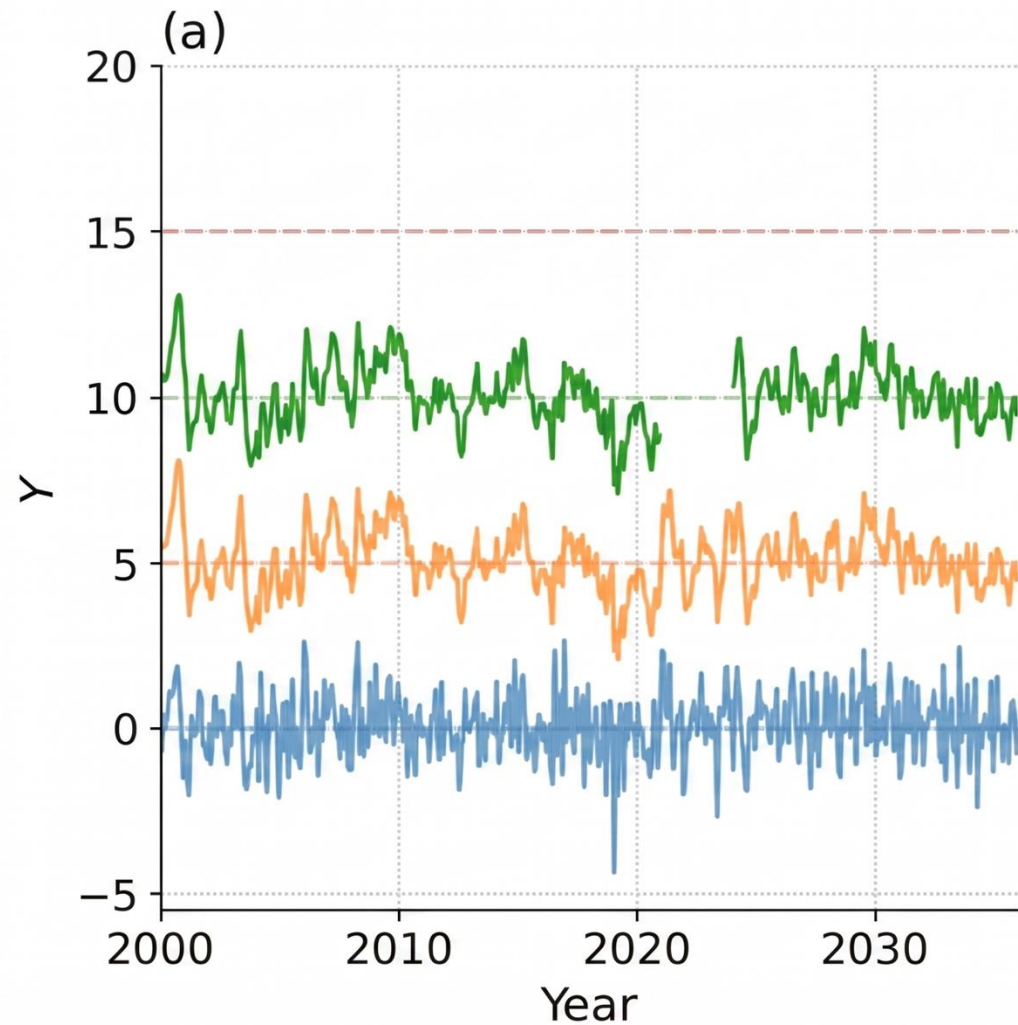




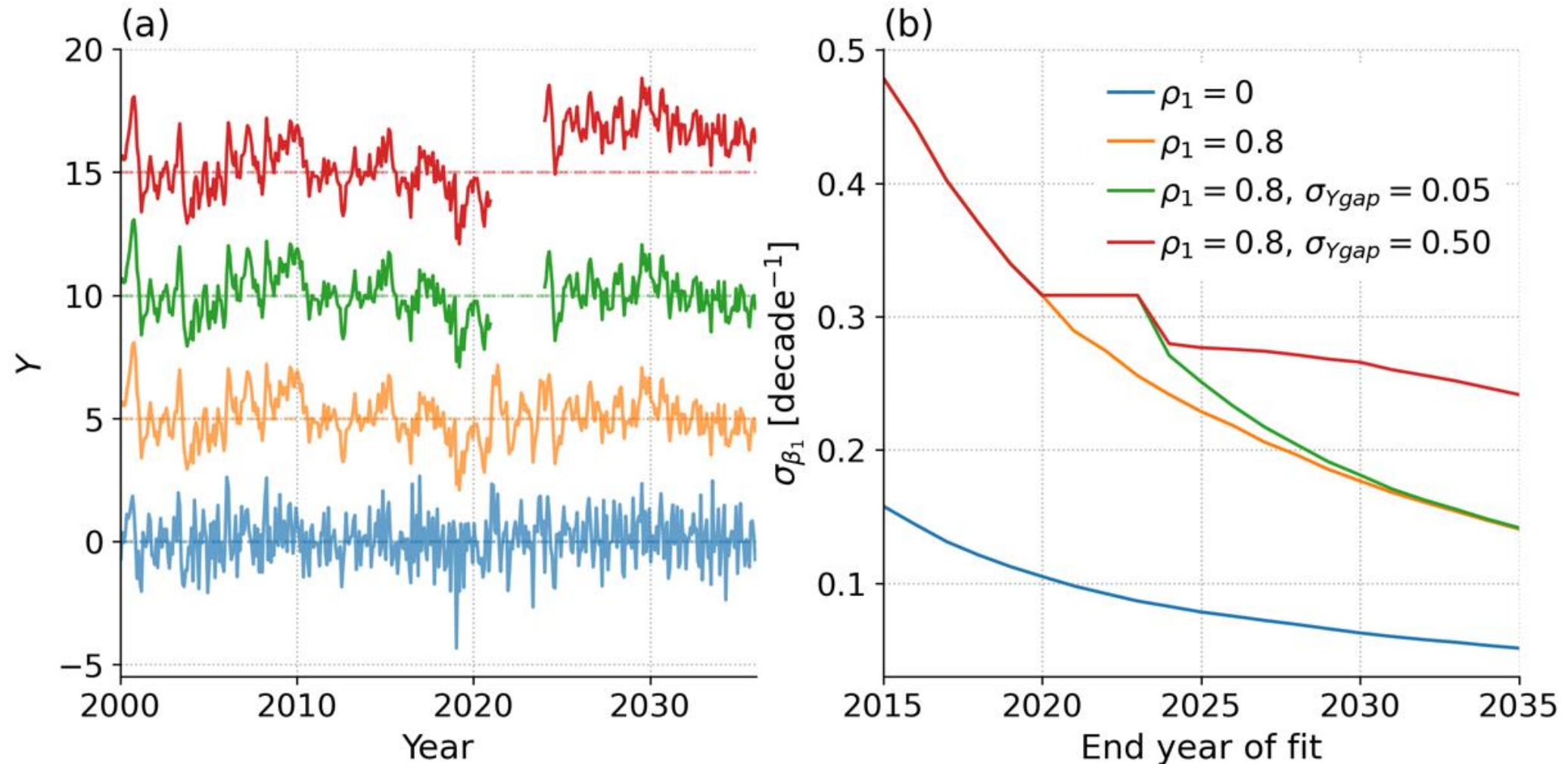
Trends errors (right) usually shrink with time, but not if $\sigma_{\Delta Y}$ is too big



Trends errors (right) usually shrink with time, but not if $\sigma_{\Delta Y}$ is too big



Trends errors (right) usually shrink with time, but not if $\sigma_{\Delta Y}$ is too big



Predict future errors by combining:

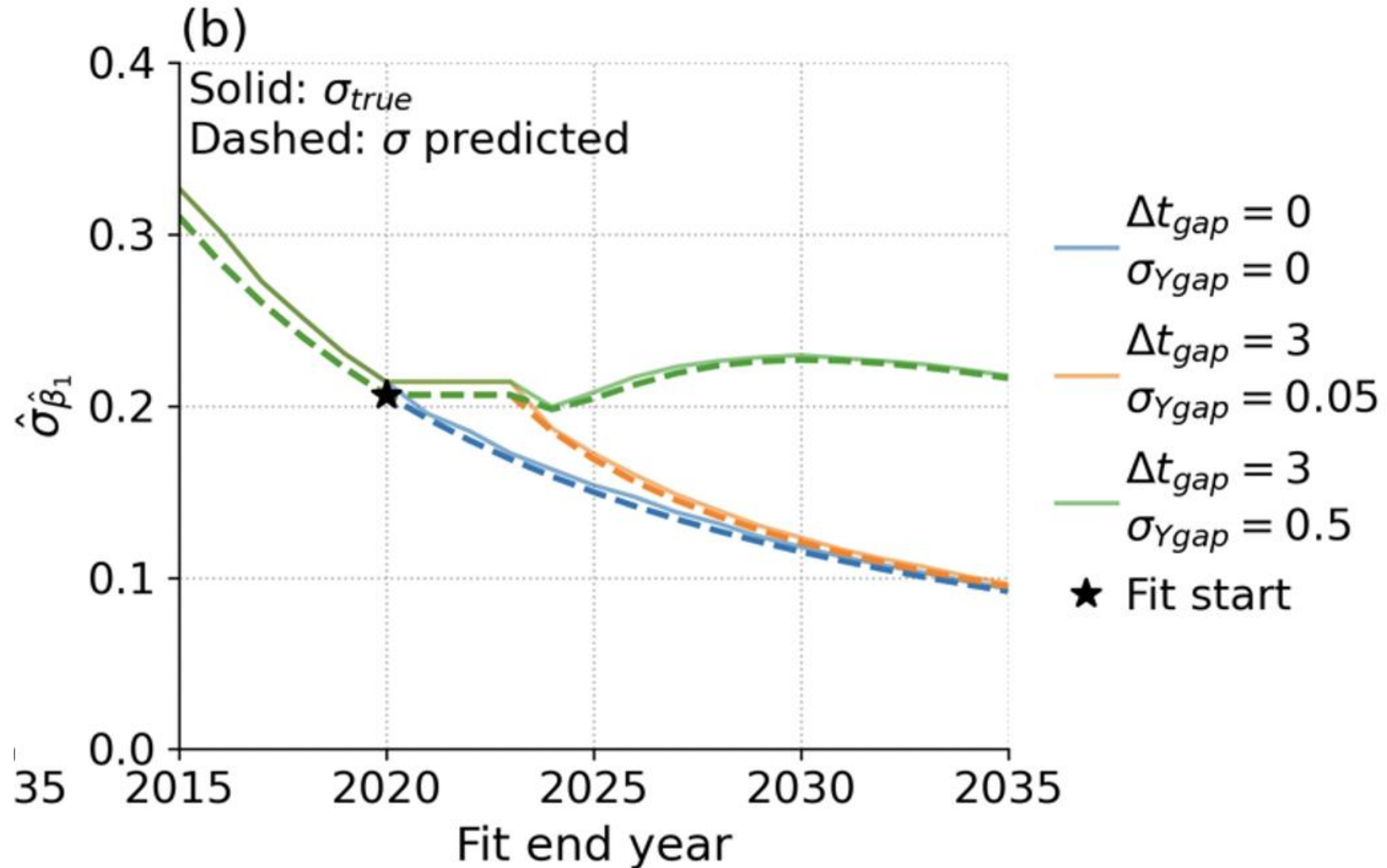
(1) Extending random component of trend today (t1)

$$\hat{\sigma}_{\hat{\beta}_1}^2 = \hat{\sigma}_{\hat{\beta}_1, t_1}^2 \frac{\sum_i^{N_{t_1}} (t_i - \bar{t}_1)^2}{\sum_i^N (t_i - \bar{t})^2}$$

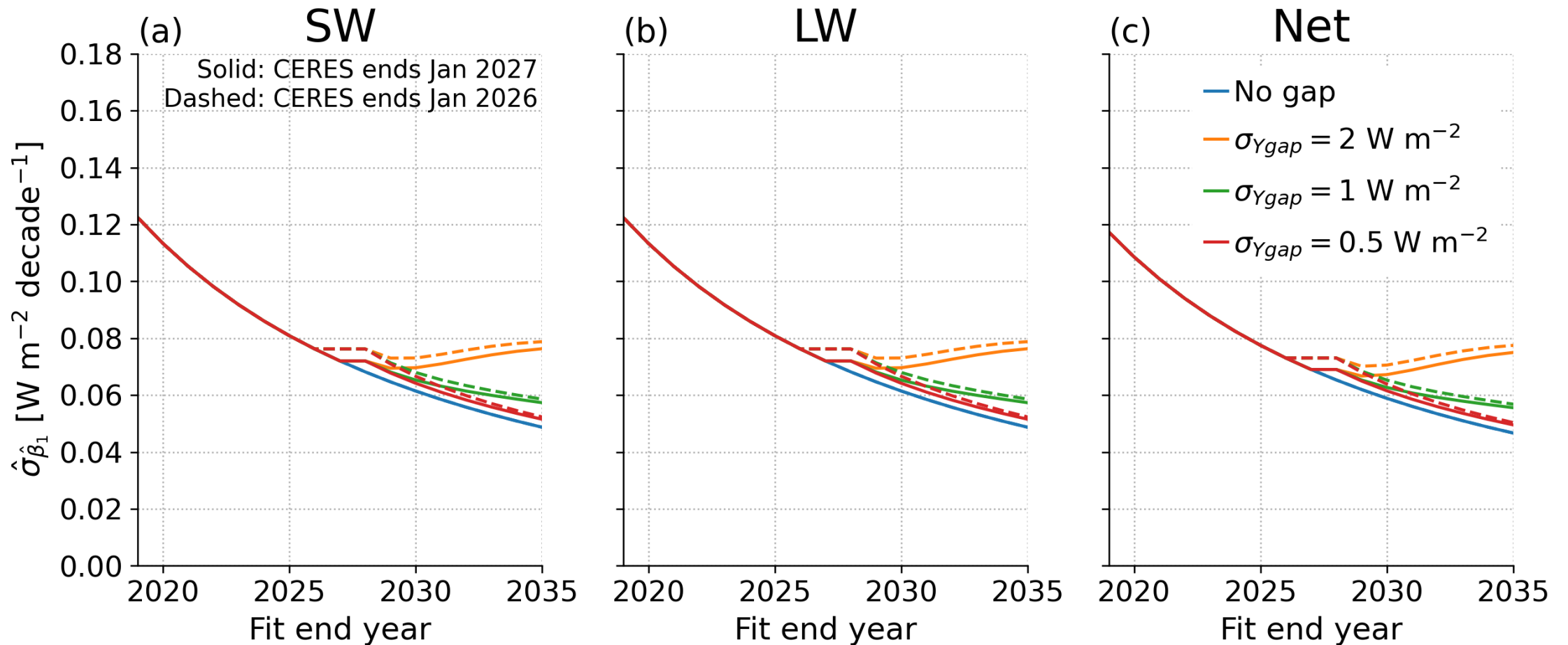
(2) Including $\sigma_{\Delta Y}$ component by fitting a step function

It works!

Predicted errors (dashed) are very close to the true errors (solid).



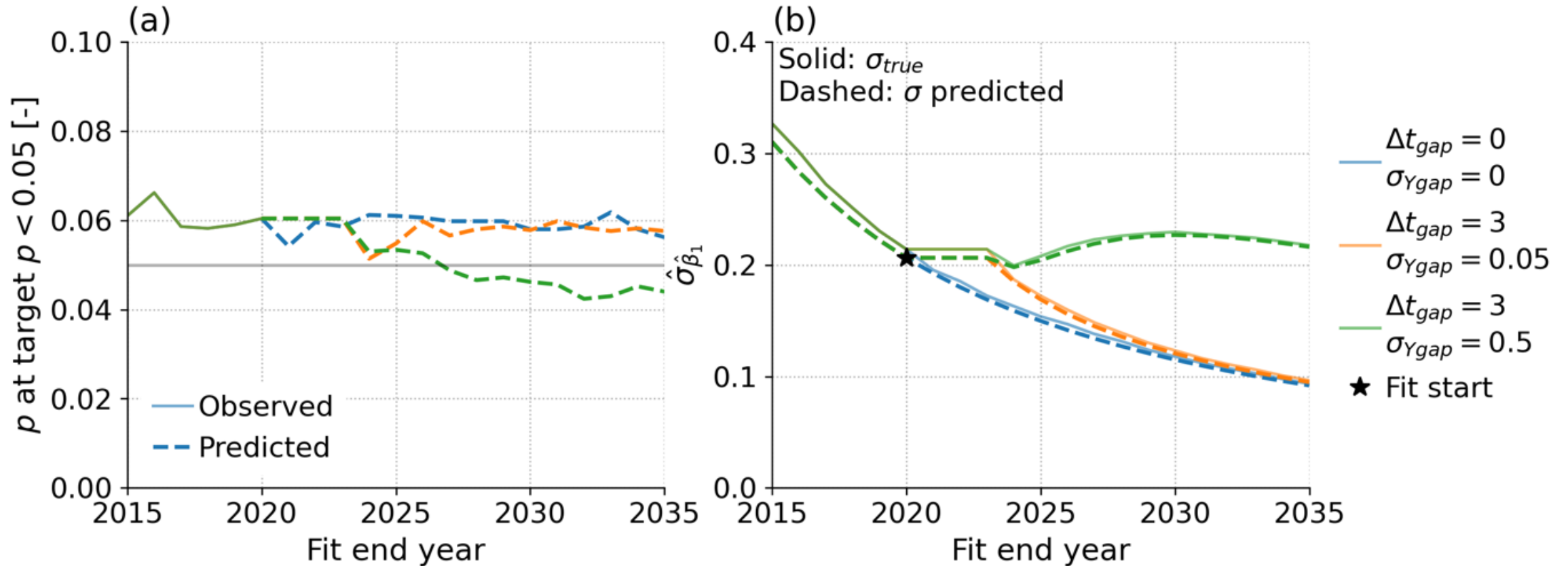
For CERES global: $\sigma_{\Delta Y} > 1 \text{ W m}^{-2}$ explodes errors



- *We can* predict trends errors for hypothetical data gaps
- The method works for any data series where we can estimate autocorrelation
- Globally? We want $\sigma_{\Delta Y} < 1 \text{ W m}^{-2}$. Regional answers may differ.

Left is p values estimated, very close to goal

Example slope error prediction with $\rho_1 = 0.6$



If you also fit a “jump” (squares/circles) you remove the dependence on the jump size, but the trend error is way larger – no more information gained by new mission

