Motivation

Visualization is crucial for exploring and understanding Earth data. While web browsers provide a widely accessible platform for data exploration, the immense scale of geospatial data complicates fast rendering. Browsers struggle to quickly read, reproject, and tile this data, impacting user experience.

Drawbacks of pre-generated map tiles

The need to visualize large geospatial datasets has led to the use of pre-generated static map tiles, which allow for quick visualization but come with significant drawbacks. The main issue is that data providers control the data's appearance, limiting user customization like adjusting color scales or combining variables ("band math"). Providers also face challenges like high storage costs and the need to continually update tiles with new data.



New Methods: Dynamic Tile Server and Dynamic Client

Recent developments in dynamic tiling allow for ondemand map tile creation, traditionally using Cloud-Optimized GeoTIFFs (COGs). With the rise of the Zarr data format for large-scale N-dimensional data, there's increasing demand for browser-based visualization of Zarr. The conventional Zarr chunk size of about 100MB is too large for efficient browser fetching.

However, there are two options for visualizing Zarr data:

- I. A tile server (titiler-xarray) using rio_tiler's XarrayReader can render tiles from any xarray-readable formats, including Zarr, netCDF4/HDF5, and others. However, this approach still necessitates running a server, while the second option,
- 2. The dynamic client reads Zarr directly in the browser client and uses webGL to render map tiles.

New open source libraries enable browser visualization of Zarr and other xarrayreadable formats, such as NetCDF.

of other variations.

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Dynamic tiler:@developmentseed/titiler-xarray





Benchmarking revealed the significance of a chunk size and evaluated performance impacts

Dynamic Tile Server



Benchmarking Results

Dynamic client



Summary

- For both methods, chunk size was found to significantly impact high resolution datasets.
- and small chunk sizes (~10MB).

Dynamic client: @carbonplan/maps

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• For the tile server, pre-processing may be **unnecessary** if the data has minimal coordinate chunking,

performance and pyramid generation will greatly improve performance for







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Dynamic tiler:@developmentseed/titiler-xarray

Dynamic client: @carbonplan/maps





