

TeleViT: Teleconnection-driven Transformers Improve Subseasonal to Seasonal Wildfire Forecasting

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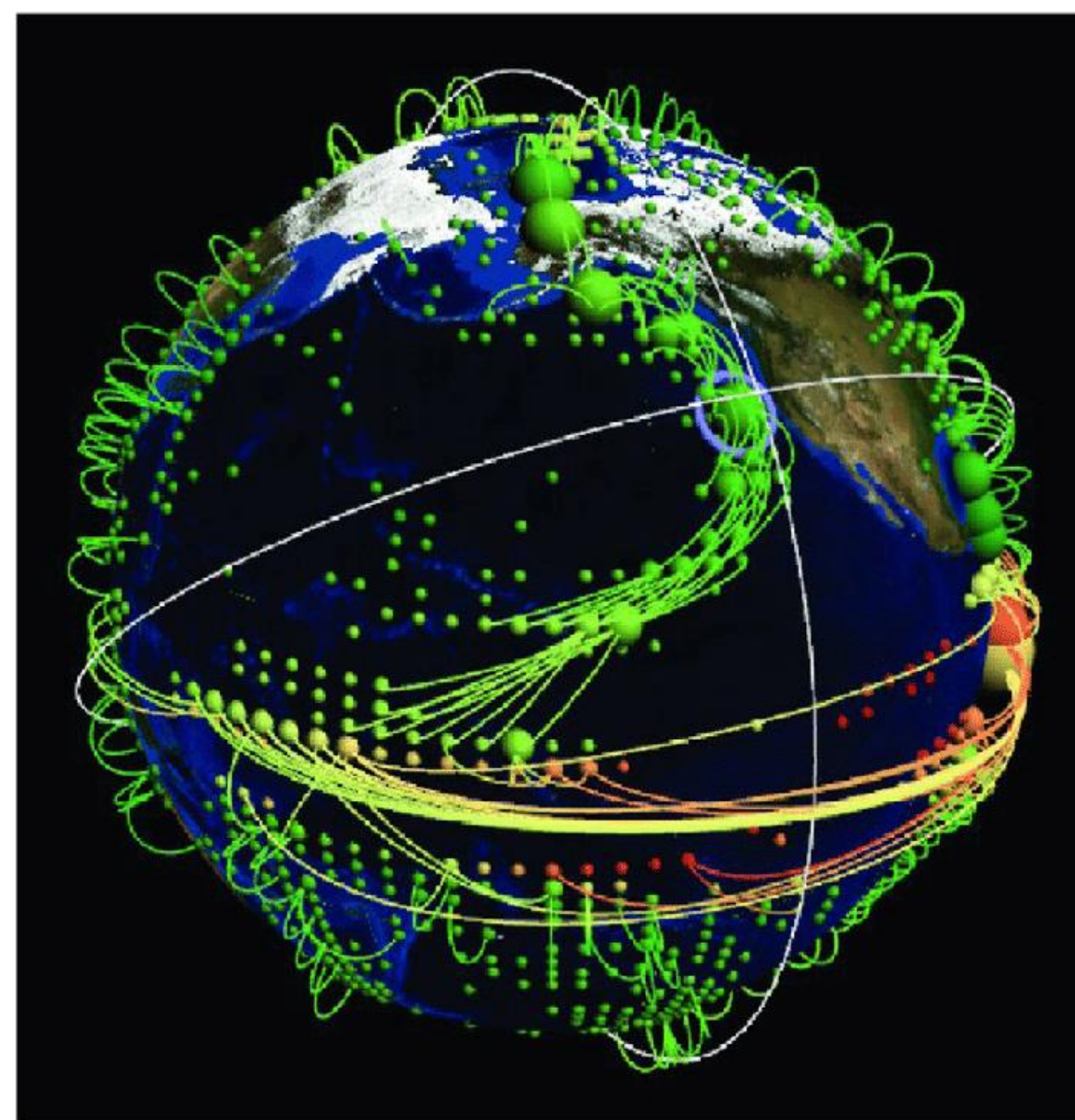
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Motivation

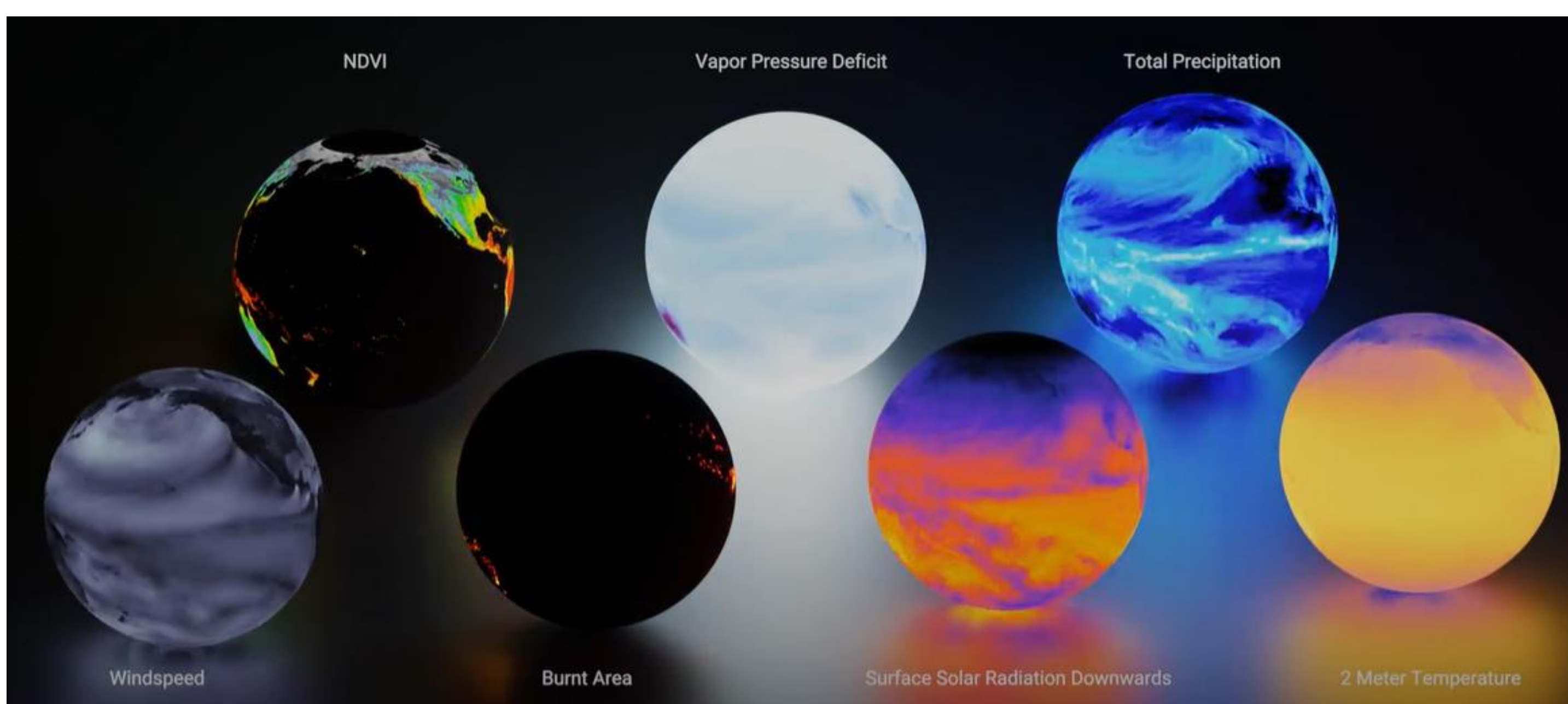
- **Warming climate:** Aggravates fire weather, increasing the *likelihood of extreme wildfires*
- **Subseasonal to Seasonal:** Important to forecast fire weeks to months in advance to improve management + HADR
- **Long-term modeling:** *Teleconnections*, i.e. large scale spatiotemporal interactions, modulate global wildfires [1, 2].

Figure 1: Spatiotemporal interactions in the Earth system [3]



SeasFire DataCube

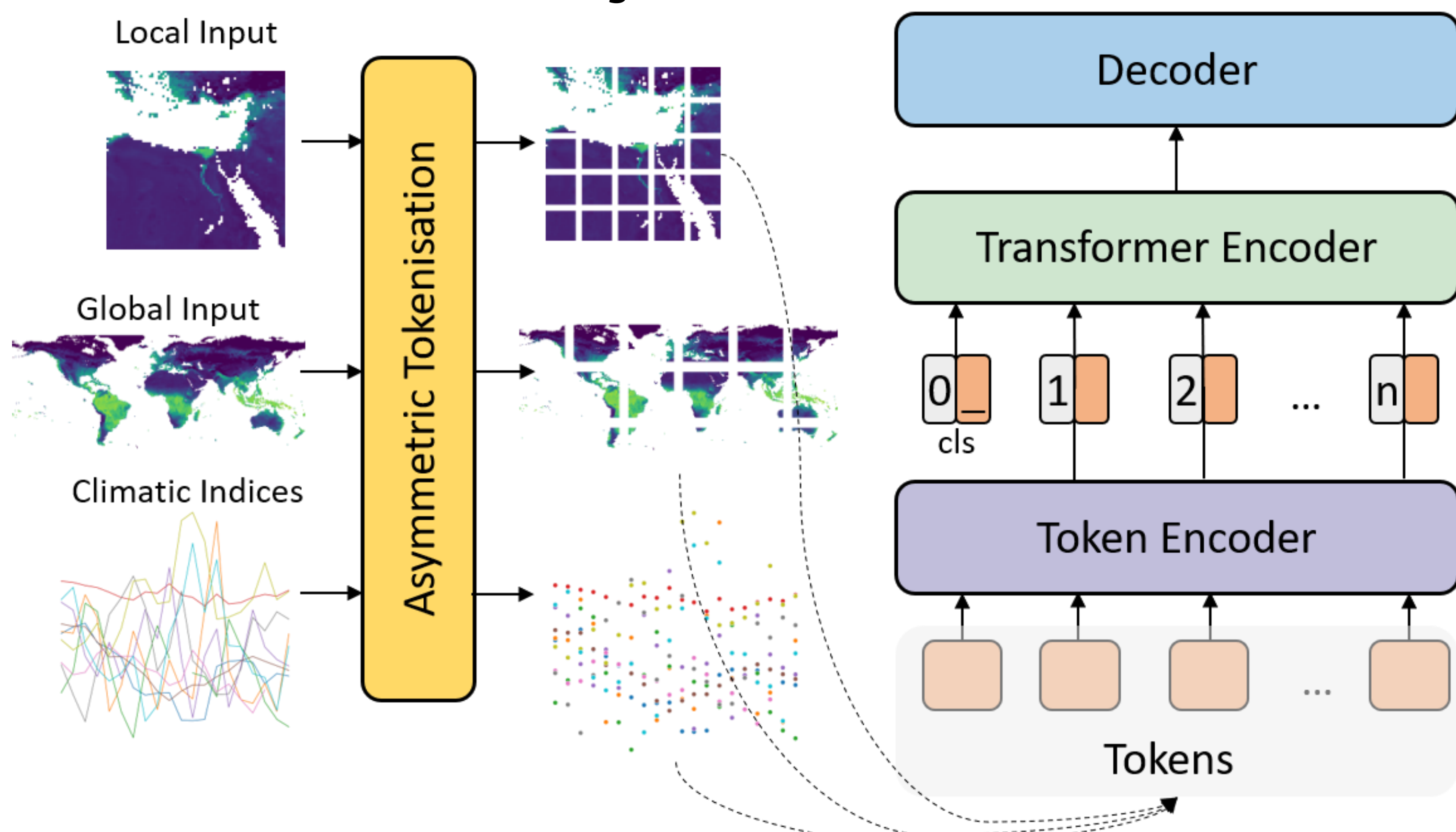
Figure 2: Snapshot of variables in the globe. Credits MPI-BGC DataVis.



- An **open-access datacube** [4] for modeling of global wildfires and their impacts.
- Variables containing **burnt areas**, and **fire drivers** such as the **meteorology, vegetation, land cover, population density and oceanic indices**.
- Spatiotemporal grid **0.25° x 0.25° x 8-days, (2001 to 2021)**

TeleViT Architecture

Figure 3: TeleViT



TeleViT combines *i) local input, ii) coarsened global input and iii) time-series of climatic indices*, tokenising each input independently. **Allows intra/inter-modal interactions.**

Results

Figure 4: Comparison of models for various forecasting windows

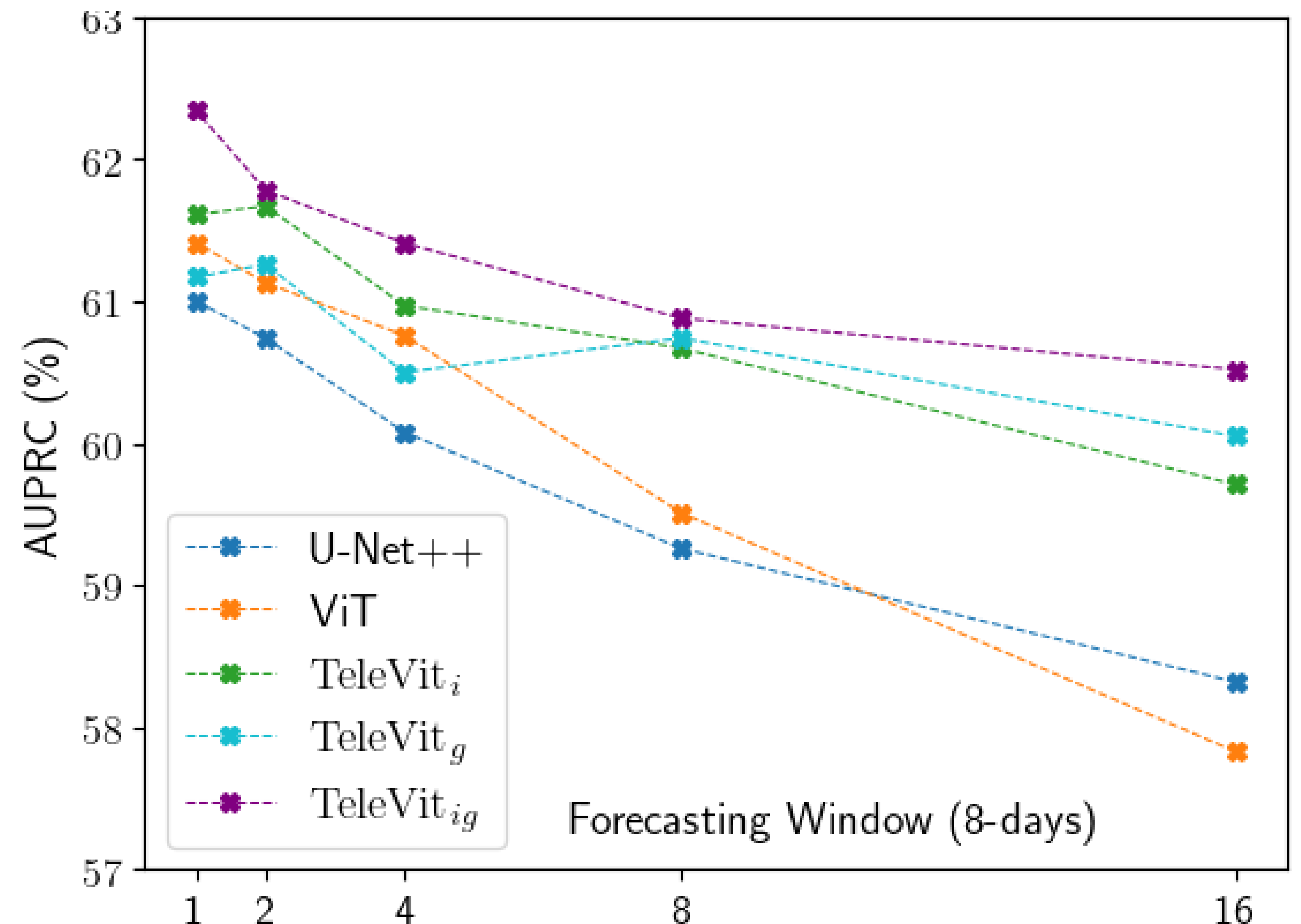
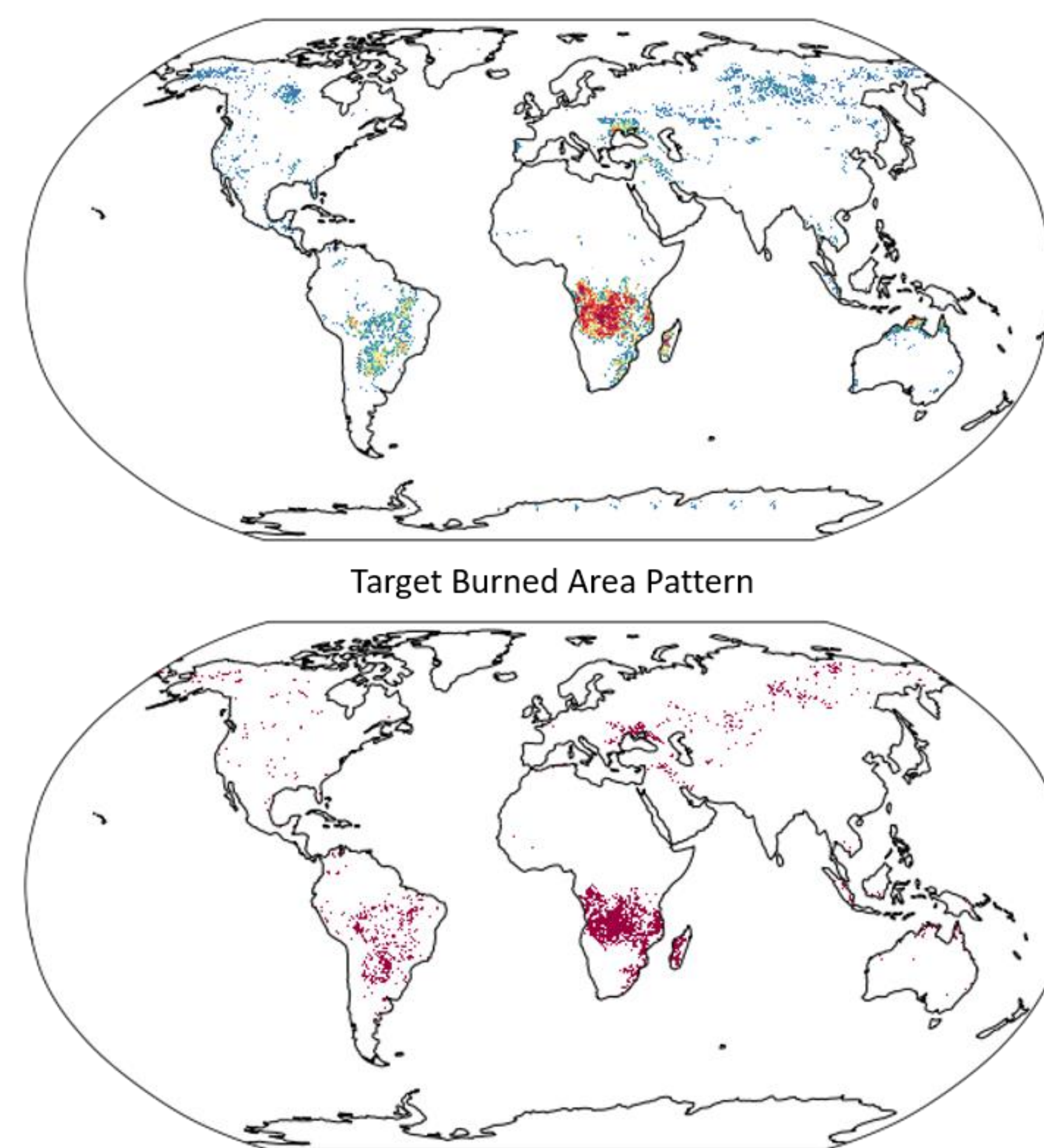


Figure 5: Sample prediction versus target
 Forecasted Burned Area Pattern Lead Time 4x8-days



- **Long-term skill improved:** Better performance from TeleViT models, especially for prediction horizon larger than 2 months
- **Input synergy:** Global input and climate indices offer complementary improvement
- **Global forecasts:** Forecasted burned area patterns match very well the target patterns

Contribution

- **Teleconnection-driven modeling improves long-term forecasting** at subseasonal to seasonal scales
- **TeleViT**, a new transformer-based architecture that *effectively combines Earth variables of different modalities*
- Paves the way for *exciting future research to improve the modeling and understanding of large-scale Earth system processes.*
- **Code available** <https://github.com/Orion-AI-Lab/televit>

References

- [1] Kim, Jin-Soo, et al. "Extensive fires in southeastern Siberian permafrost linked to preceding Arctic Oscillation." *Science advances* 6.2 (2020): eaax3308.
- [2] Cardil, Adrián, et al. "Climate teleconnections modulate global burned area." *Nature Communications* 14.1 (2023): 427.
- [3] Fan, Jingfang, et al. "Statistical physics approaches to the complex Earth system." *Physics reports* 896 (2021): 1-84.
- [4] Alonso, Lázaro, et al. *Seasfire Cube: A Global Dataset for Seasonal Fire Modeling in the Earth System*. 0.3, Zenodo, 19 June 2023, doi:10.5281/zenodo.8055879.

