









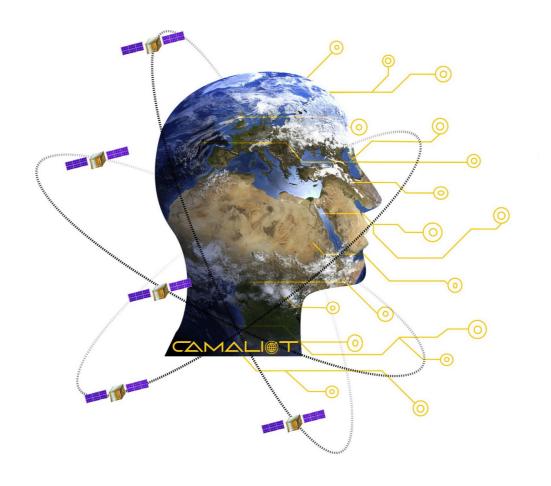




# Application of machine learning technology for GNSS IoT data fusion

(NAVISP-EL1-038 bis)

funded by ESA NAVISP Programme Element 1, dedicated to innovation of the PNT technology











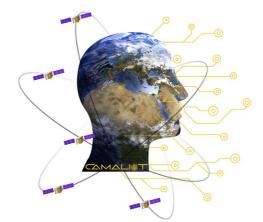
#### **Camaliot - Goals**



- **GNSS IoT Data** 
  - Investigate alternative sources of GNSS observations
  - **Collection of GNSS community data**
- **GNSS Big Data Processing** 
  - Framework for an automated, robust and scalable GNSS processing
  - Fusion of indices and models with huge and heterogeneous data sets of various quality

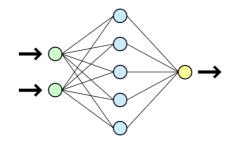


- Troposphere Earth Weather
- Ionosphere Space Weather



















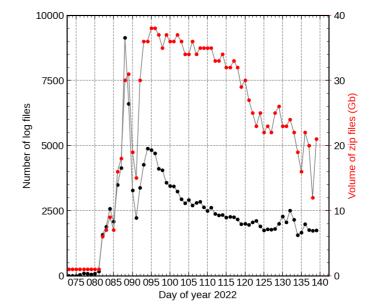




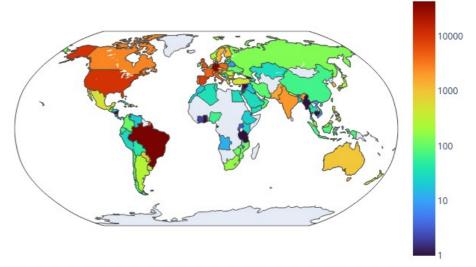
## Camaliot - Crowdsourcing Campaign

- Started March 17, 2022
- Android app with 35k+ installations
- 11k+ registered users
- Over 55 billion GNSS observations collected so far









Quantity of uploaded files per country (until May 21)











#### **Camaliot - Goals**



#### **GNSS IoT Data**

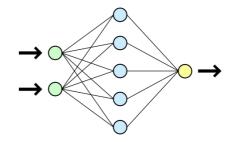
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- Collection of GNSS community data





#### **GNSS Big Data Processing**

- Framework for an automated, robust and scalable GNSS processing
- Fusion of indices and models with huge and heterogeneous data sets of various quality



- Science Use Cases
  - Troposphere Earth Weather
  - Ionosphere Space Weather









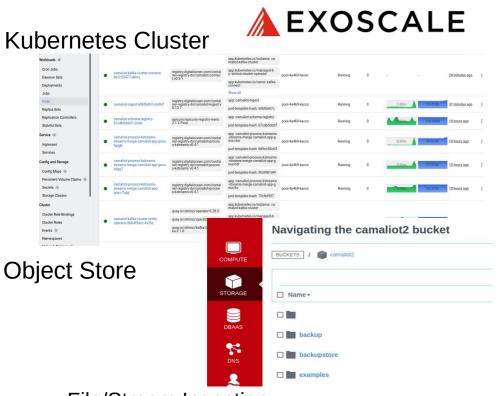






#### Camaliot Functional SW Architecture

Development of a self-contained SW running on Kubernetes and communicating with GSSC



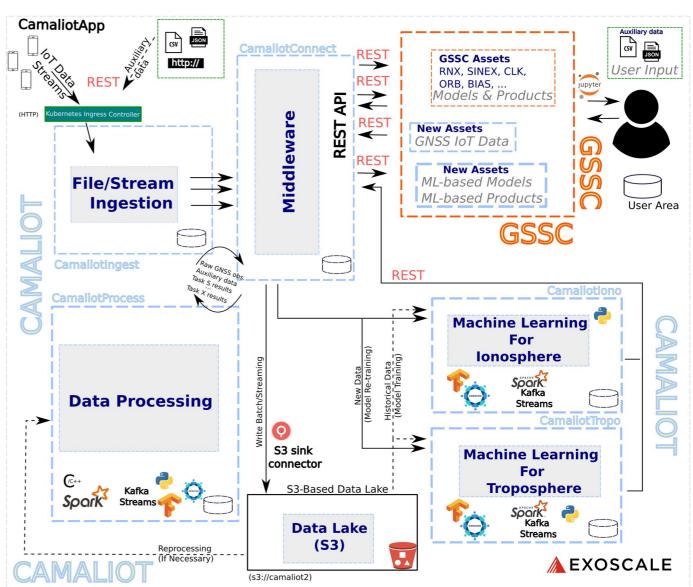
- File/Stream Ingestion
- Data/Stream Processing
- Real-time Data Enrichment
- Data offload/aggregation













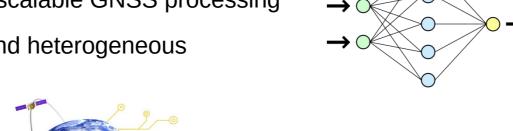
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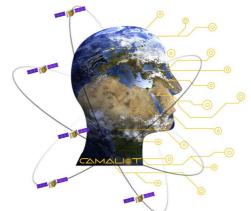


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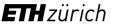
#### Science Use Cases

- Troposphere Earth Weather
- Ionosphere Space Weather











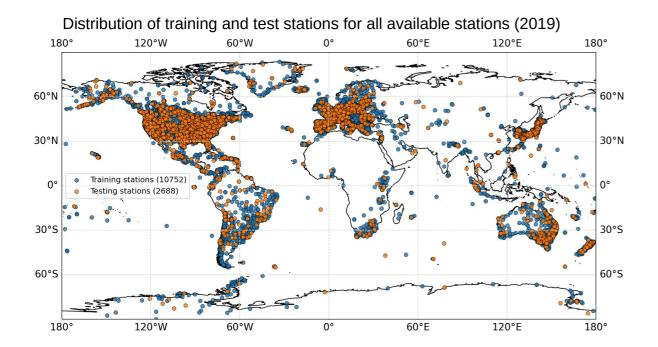




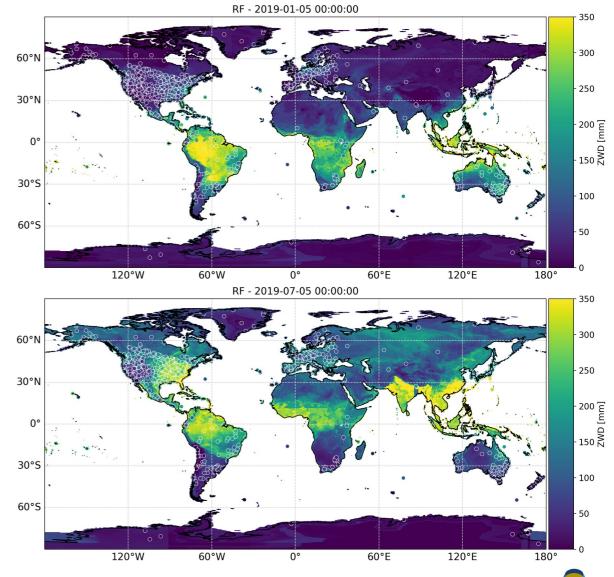


### Machine Learning For Spatial Interpolation and Forecasting

Example: Data fusion for the spatial modelling of ZWD



Talk by Laura Crocetti G1.3: Fri, 27 May, 09:45











## **GNSS IoT Data Collection & Exploration**

Exploring smartphone-based observations with dedicated measurement campaigns



**Smartphones for STEC:** 

- Observations in the vicinity of the AGNES ETH2 station
- Geometry-free (L1/L5) combination for STEC
- Observations in the RINEX-3 format (Geo++ RINEX Logger)
- Investigating "raw" satellite-specific STEC time series for smartphones and ETH2



Platform for horizontal/vertical smartphone orientation during measurements

Mi8







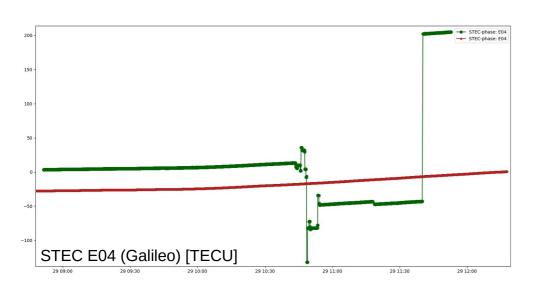


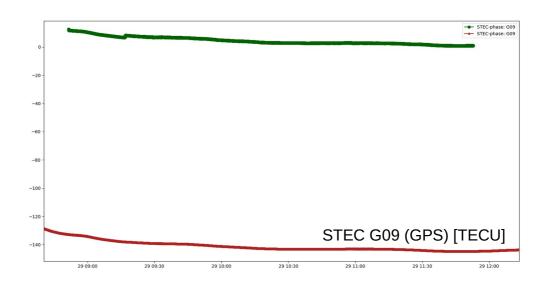


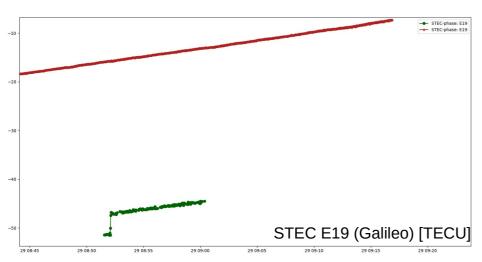


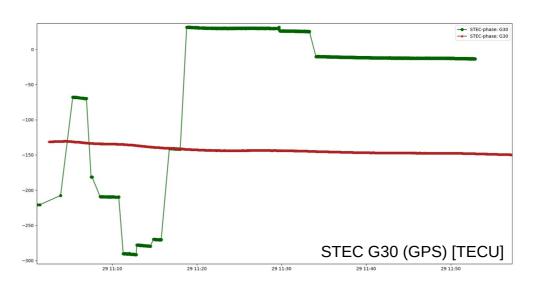
## **GNSS IoT Data Collection & Exploration**

Examples of STEC time series from Xiaomi Mi8 (green) and ETH2 (red)













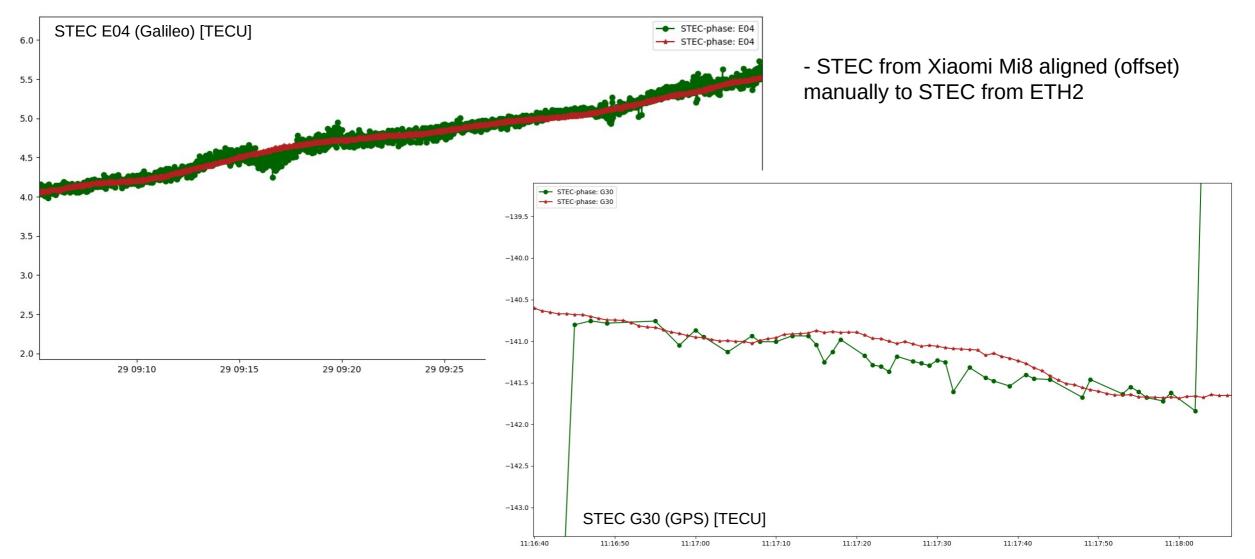






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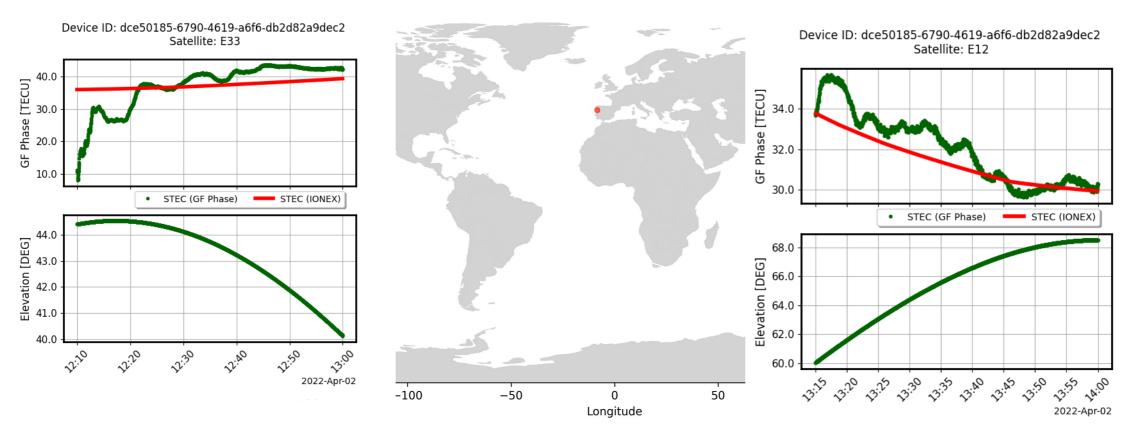




## **GNSS Community Data**

Examples of STEC time series from crowdsourced observations (as acquired from the Camaliot app)

- Observations uploaded by the users
- Geometry-free (L1/L5) combination for STEC
- Observations in the RINEX-3 format (Camaliot RINEX Converter)
- Investigating "raw" satellite-specific STEC aligned to the IONEX-based STEC time series (GIM from IGS)







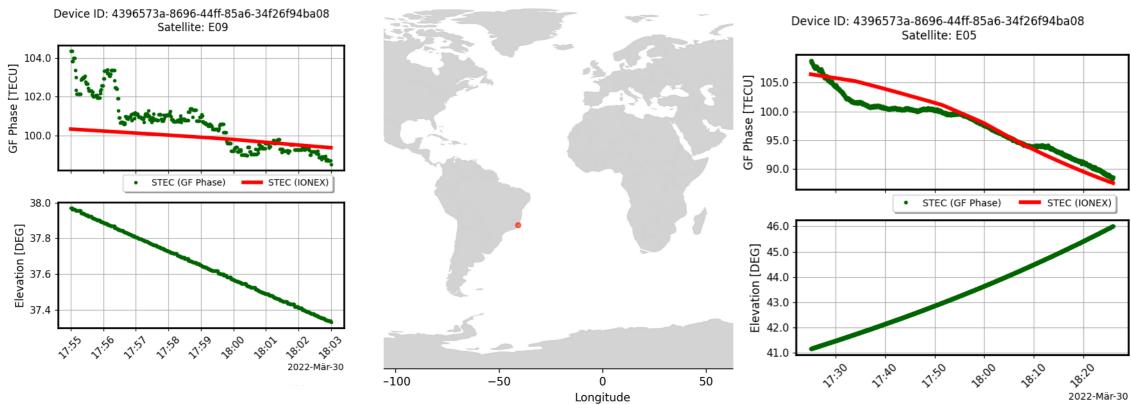




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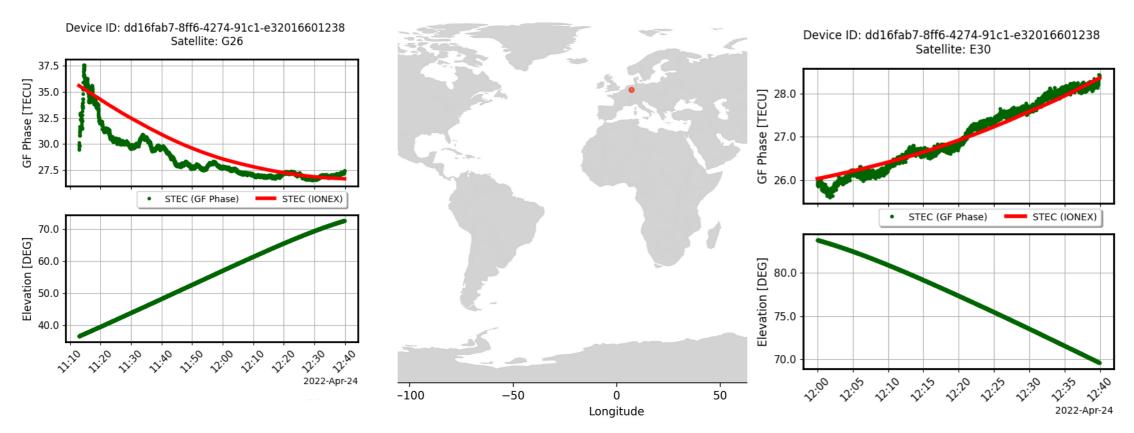




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## Summary



#### **Camaliot Project:**

- Collection of GNSS community data during the dedicated crowdsourcing campaign
- Development of the GNSS big data processing framework for the ML-based data fusion at scale

#### **Smartphone-based GNSS observations:**

- With the potential to be exploited for ionospheric monitoring (to a certain extent)
- Quality much lower compared to the conventional GNSS observations
- Frequent occurrence of observation gaps and cycle slips
- Dedicated screening and preprocessing stages needed to extract reliable ionospheric information

Visit <a href="https://www.camaliot.org">www.camaliot.org</a> for more!

Try out the Camaliot App today!













### **THANK YOU FOR YOUR ATTENTION!**

klopotek@ethz.ch







