

SKYFORA

Next-generation weather intelligence

Novel uses of GNSS for meteorology

10/23/2022



Skyfora in a nutshell

The company is built on the insight that machine learning and new measurement techniques revolutionize weather forecasting.

Key personnel has decades of experience in weather instrumentation, GPS/GNSS engineering, machine learning and weather forecasting.

Products:

- AI Weather Forecasts for renewable energy, insurance etc
- World's lightest weather sonde
- **GNSS meteorology data**

Staff: 13

Turnover: 255 k€

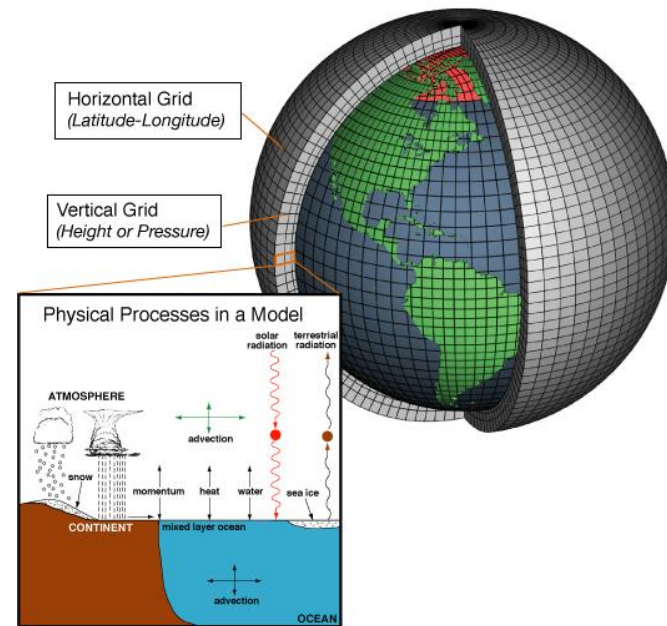
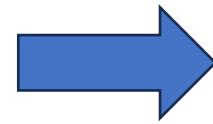
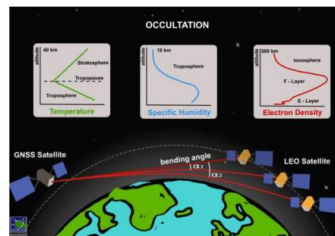
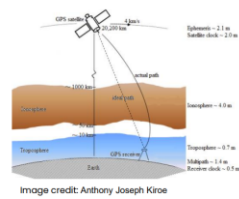
Funded by: EIC accelerator, European Space Agency, Business Finland, Voima Ventures, Icebreaker VC etc

GNSS and meteorology (until now)

- Radio signals get delayed and bent in the atmosphere
- For GNSS frequencies, zenith dry delay ~ 2.3 m, wet delay ~ 0.1 – 0.5 m
- Since 1990s: ZTD and RO **assimilated** in Numerical weather prediction

Zenith Tropospheric Delay (ZTD)
is a known technology to calculate meteorological parameters (water vapor, pressure and temperature) used as input in numerical weather predictions to improve weather forecasting

Radio Occultation (RO)
is traditionally done with Low Elevation Orbiting (LEO) satellites, and with aircrafts (ARO). The obtained data is used today in meteorology as input in numerical weather predictions.



Climate Change makes weather more extreme and less predictable



Wildfires



Heatwaves



Water scarcity



Intensifying Storms



Droughts



Rising Sea Levels



Melting Polar Ice



Floods



New rainfall patterns



The World Bank:

*"Weather-sensitive sectors could benefit over **€160 billion annually** from improved weather intelligence"*

Between 1980 and 2021, weather- and climate-related extremes caused losses estimated at EUR **560 billion** in the EU Member States*

2022 damages:

- Hurricane Ian > \$100bn
- European drought > \$20bn
- Flooding in China > \$12bn
- Drought in China > \$8bn
- Flooding in Australia > \$7bn

Pakistan floods **displaced 7m** people and caused more than **\$30 billion** in damages. Only \$5.6 billion covered by insurance. **1739 killed.**

Only 0.004% of atmosphere is measured

Traditional physical simulations for weather forecasting are insufficient

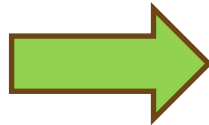
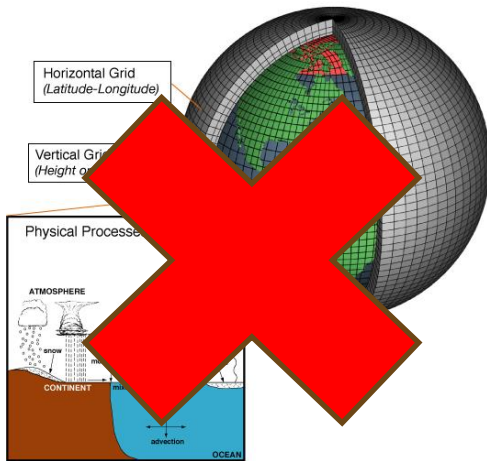
New technologies allow for new approaches



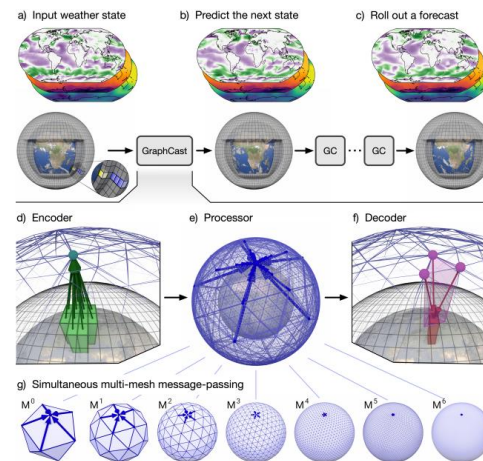
The need is imminent – Industries and governments need to adapt

GNSS and meteorology in the AI era

- Recent breakthrough: graph neural network based weather forecasting is at a par with numerical weather predictions
- AI algorithms are capable of digesting much larger volumes of data than numerical methods



GraphCast: Learning skillful medium-range global weather forecasting



Forecasting Global Weather with Graph Neural Networks

Ryan Keisler
rkeisler@gmail.com

Abstract

We present a data-driven approach for forecasting global weather using graph neural networks. The system learns to step forward the current 3D atmospheric state by six hours, and multiple steps are chained together to produce skillful forecasts going out several days into the future. The underlying model is trained on reanalysis data from ERA5 or forecast data from GFS. Test performance on metrics such as Z500 (geopotential height) and T850 (temperature) improves upon previous data-driven approaches and is comparable to operational, full-resolution, physical models from GFS and ECMWF, at least when evaluated on 1-degree scales and when using reanalysis initial conditions. We also show results from connecting this data-driven model to live, operational forecasts from GFS.

Instrument type	Number	Unique data points per 10 min
Weather stations	10000	$10000 * 1 = 10000$
Upper-air stations	1000	$1000 * 4 * 300 / (24*6) = 8000$
Ships	7000	$7000 * 1 = 7000$
Buoys	1000	$1000 * 1 = 1000$
Weather radars	500	$500 * 1000 = 500\ 000$
Aircraft	3000	$3000 * 3 = 9000$
Meteorological satellites	30	$30 * 10\ \text{ch} * 100\ 000$ = 30 million
Research satellites	200	10s of millions
Dual-band GNSS receivers	3 million?	$3\ \text{million} * 40\ \text{sat/rec} / 3 =$ 30 million

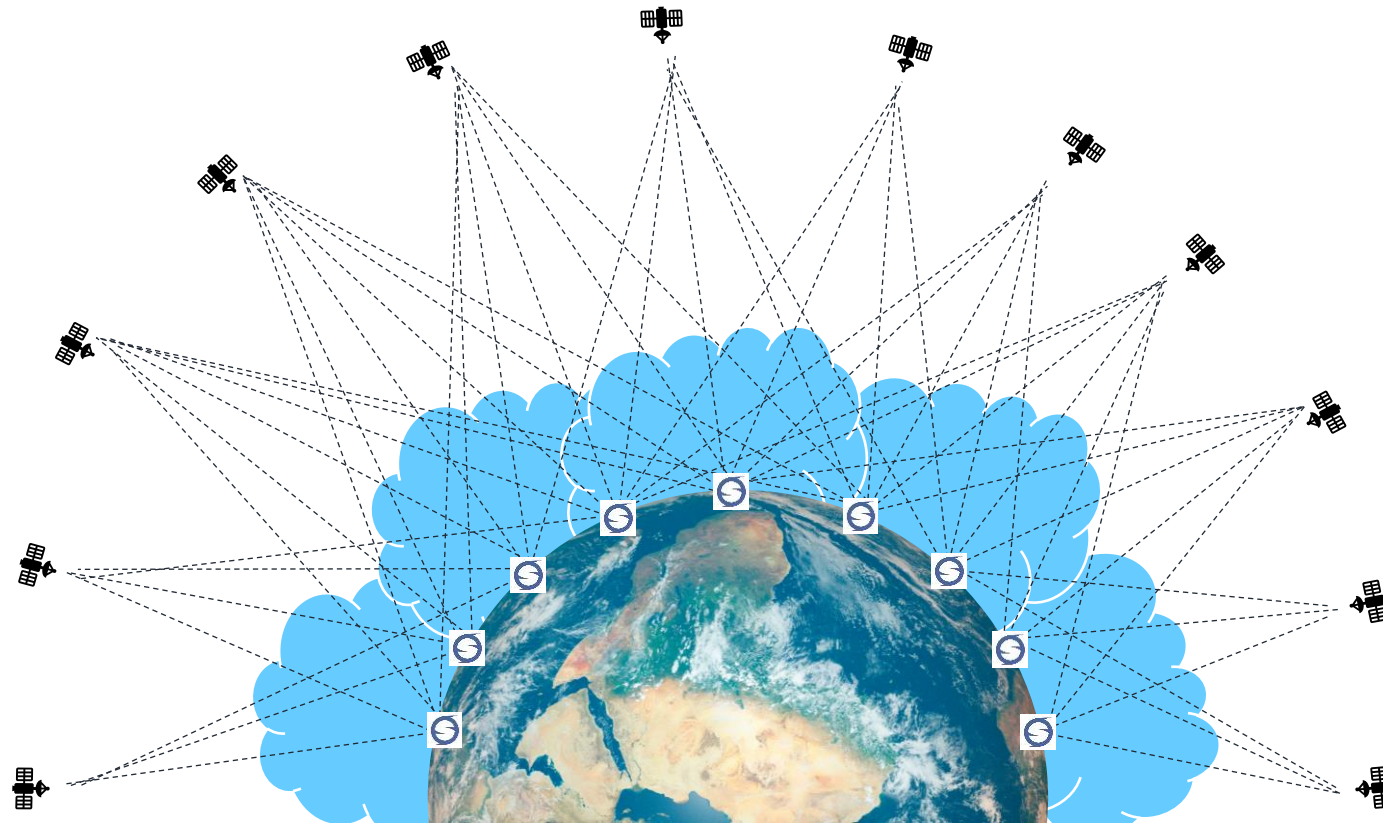
The “Tomographic Era” of Weather

By measuring GNSS signal delays in all directions:

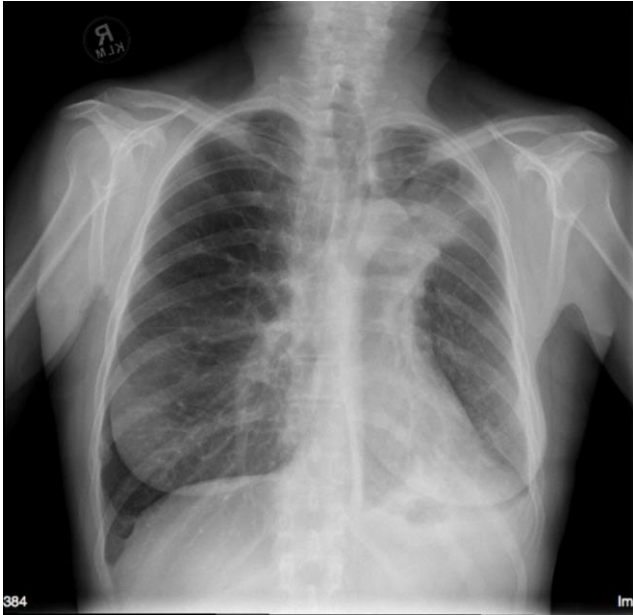
- Much larger volume of data than before from **GNSS slant delays from large number of receivers**
- Humidity, temperature, pressure and wind is imaged clearly in high resolution in 3D
- Relevant information also for space weather
- Instrument and calibration independent solution also good for climate change monitoring
- Made possible by the abundance of dual-band GNSS receivers

~ 40 GNSS satellites visible globally

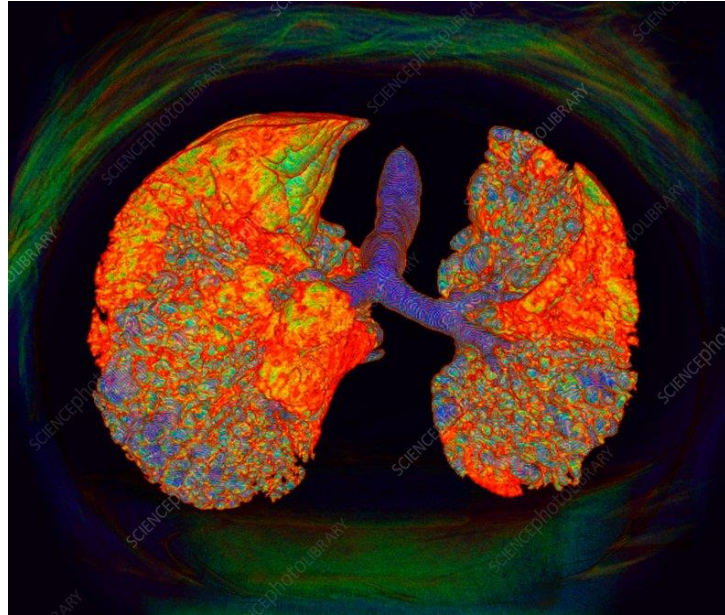
- GPS, Galileo, Beidou
- Sending on 2 frequencies



Analogy Medicine



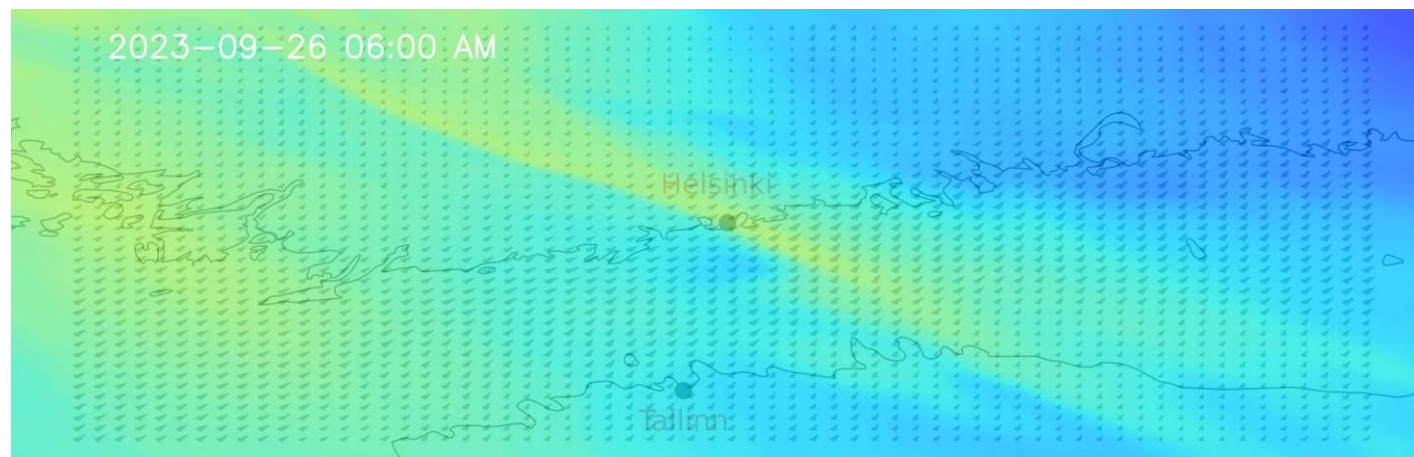
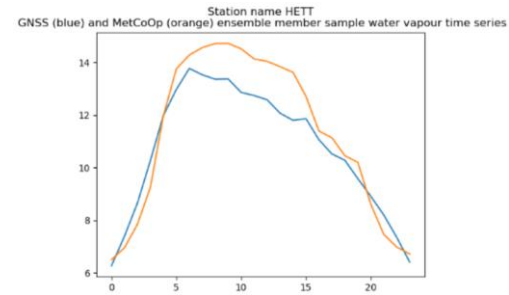
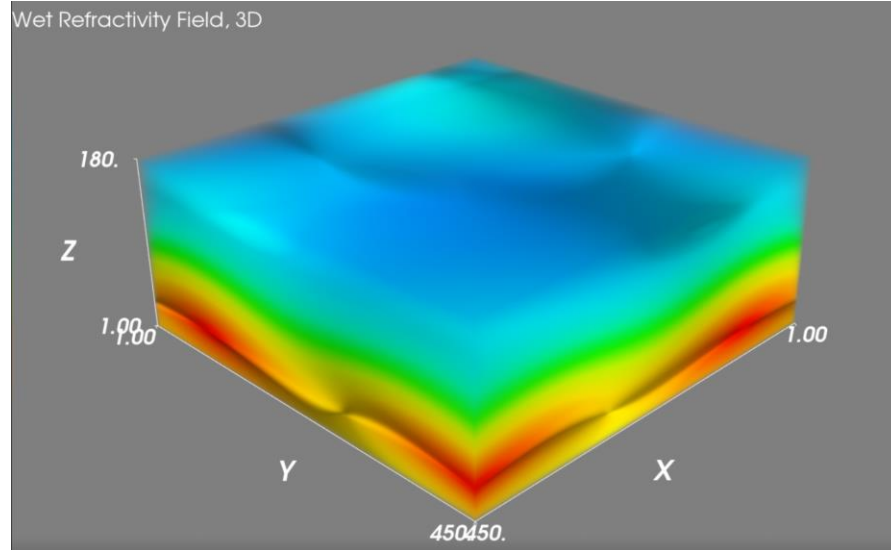
1890s 2D X-ray images



1971- 3D tomography images

Many types of diseases or tumors can only be seen in tomography images, or they can be seen much earlier for impactful treatment

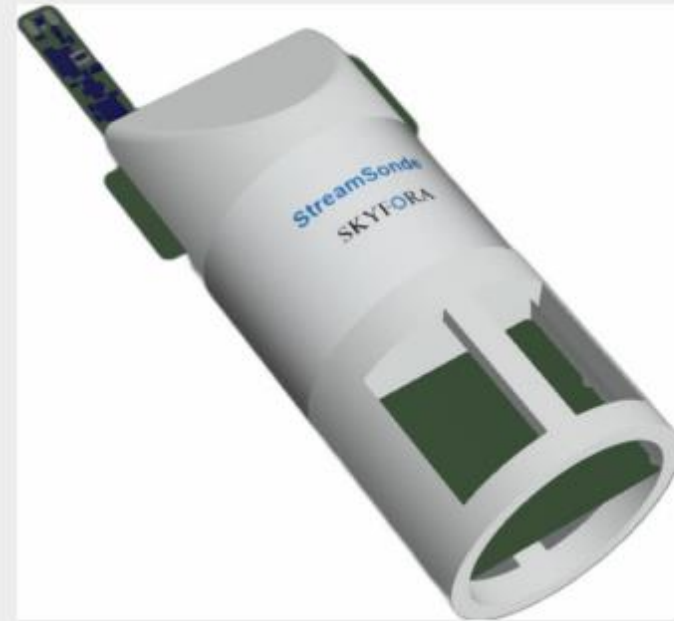
Wet refractivity in great detail



Underlying technology: Proprietary Receivers and Weather Sensors

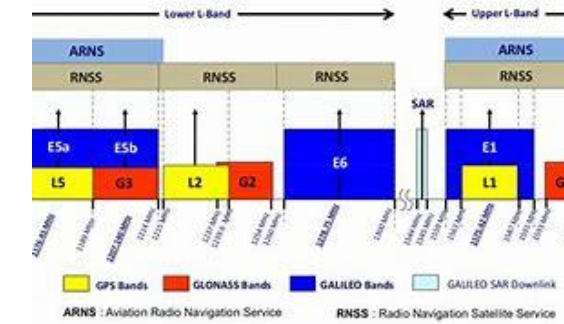
Skyfora's GNSS receiver is a low power custom built Dual-band receiver in a 10x10mm form factor

- StreamSondes utilizing dual band GNSS is already in use by NOAA Hurricane Hunters
- Dual band receiver capable of using
 - GPS L1CA & L5
 - Galileo E1B & E5a
 - Beidou B1I, B1C & B2A
 - QZSS L1CA, L1S & L5
 - Navic
- NMEA & RTCM protocols (MSM7 messages)
- GNSS antenna is omni-directional as the orientation of the StreamSonde can not be controlled



Skyfora

Evolution of wind measurements



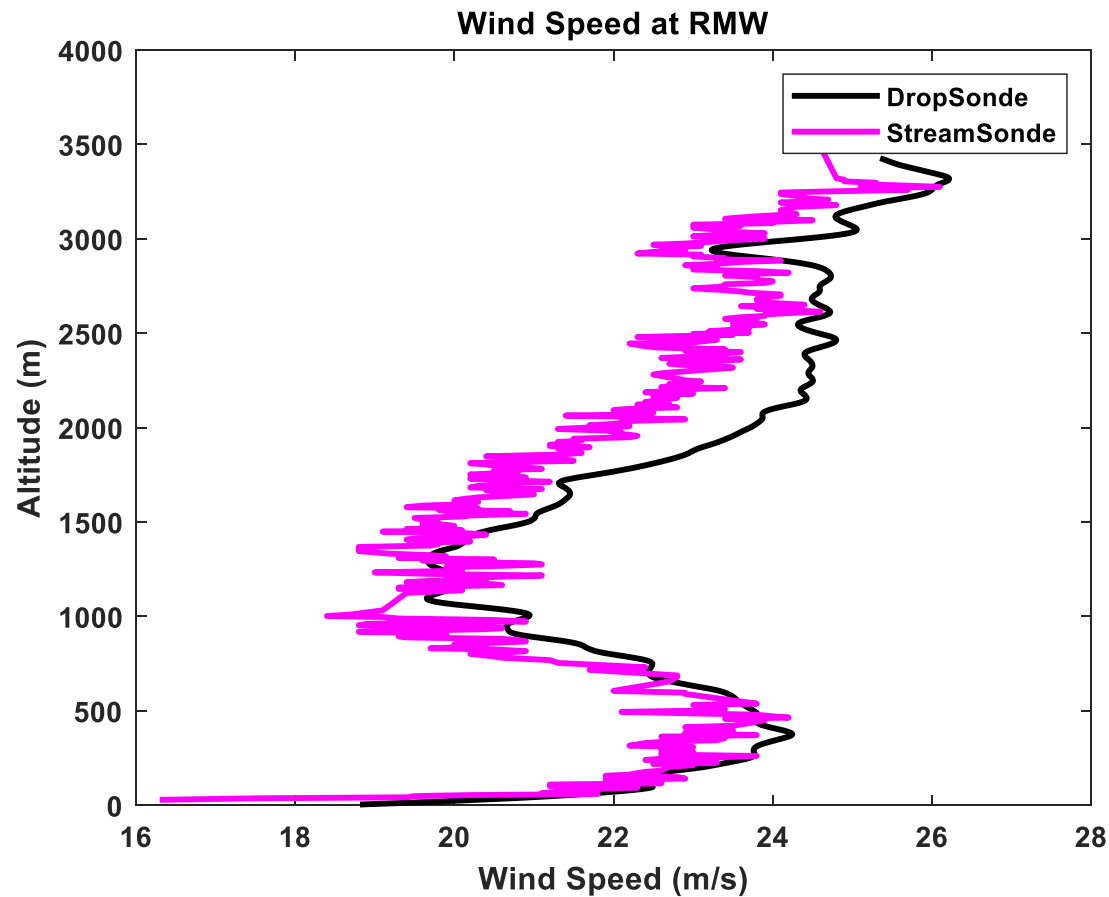
	Omega	Loran-C	GPS (single band)	GNSS (dual band) (Skyfora)
Coverage	Global	Regional	Global	Global
Availability in sondes	→1997	Not utilized today	1996 →	2022 →
Accuracy (vel.)	10m/s	5m/s	0.5m/s	0.2m/s
Accuracy (pos.)	~1km	~100m	2.5m	1m
Number of visible satellites	N/A	N/A	12	40
Number of usable signals	N/A	N/A	12	80
Satellite signals	N/A	N/A	GPS L1C (Galileo E1)	GPS L1C & L5 Galileo E1 & E5a Beidou B1I, B1C & B2a QZSS L1 & L5

10x
Improvement

2.5x
Improvement

StreamSonde

StreamSonde DS in Hurricane Nigel



NHC (National Hurricane Center) analysis and comparison

- Skyfora D-file vs.
- AVAPS/ASPEN D-file

Higher level of wind details with StreamSonde

StreamSonde:
Un-filtered dual band
GNSS winds

DropSonde:
Filtered single band
GPS winds



Ongoing and planned projects

- EIC accelerator GNSS meteorology project 2023–2025
 - R&D on GNSS data, hardware, tomography
 - Business model development and piloting
- ESA Navisp planned in collaboration with University of Vaasa:
 - 20Hz data from LEO-PNT demonstrator satellite
 - Tallysman TW3972E embedded triple band GNSS patch antenna with L-band designed for triple frequency precision positioning
 - PPP solution to be used
- Collaborations with Finnish Geospatial Research Institute, Aalto University and other academic institutions
- Weather sonde with precise positioning
- Open to collaboration, come and discuss!



SKYFORA

www.skyfora.com

Thank you!

Contact:

+358 50 4087900

svante.henriksson@skyfora.com

Itälahdenkatu 25, Helsinki, Finland