The Universe, The Earth

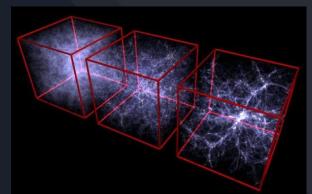
(a personal journey through space, computers and music)

Edoardo Carlesi, PhD, Machine Learning Specialist, Bass player



OUTLINE

The Universe: Cosmological simulations



The Earth:

Satellite observations and machine learning

Uranus: Music and parody

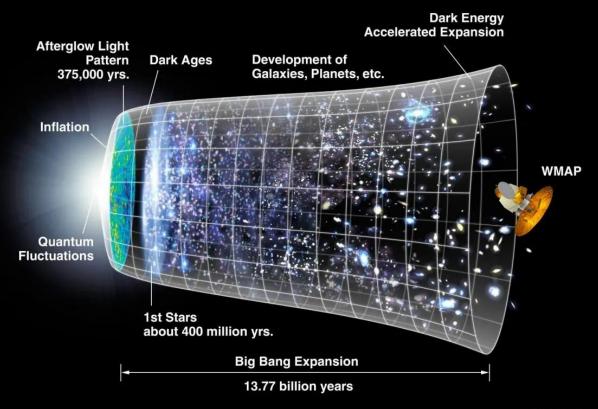








The Universe

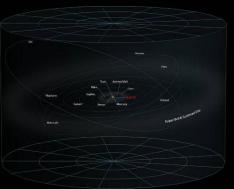


NASA/WMAP Science Team

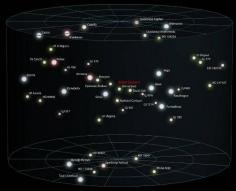
Earth



Solar System



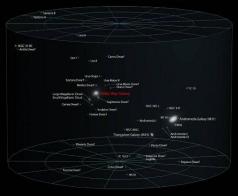
Solar Interstellar Neighborhood



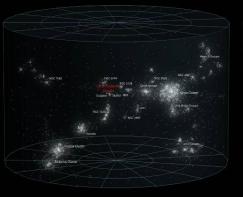
Milky Way Galaxy



Local Galactic Group



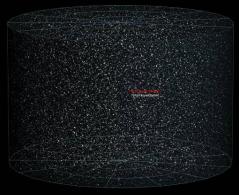
Virgo Supercluster

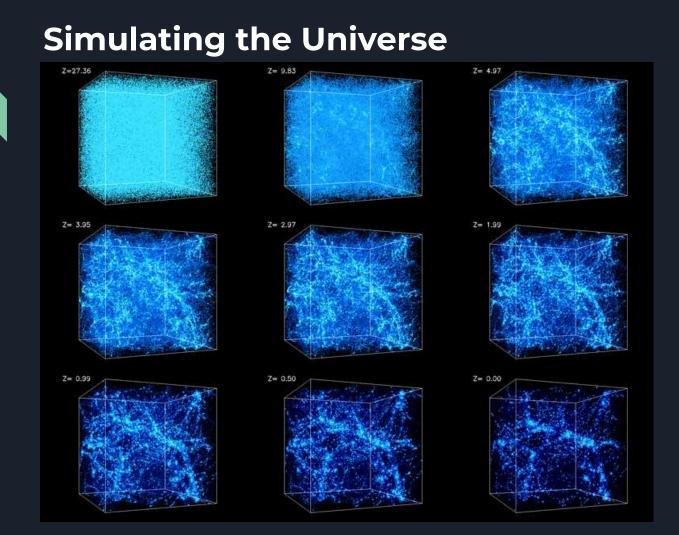


Local Superclusters



Observable Universe



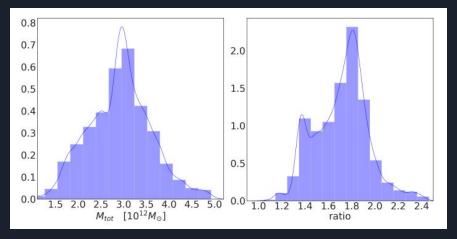


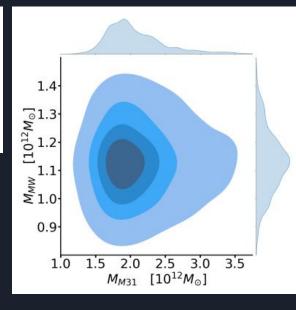


Cosmological simulations & Machine Learning

Estimation of the masses in the Local Group by Gradient Boosted Decision Trees

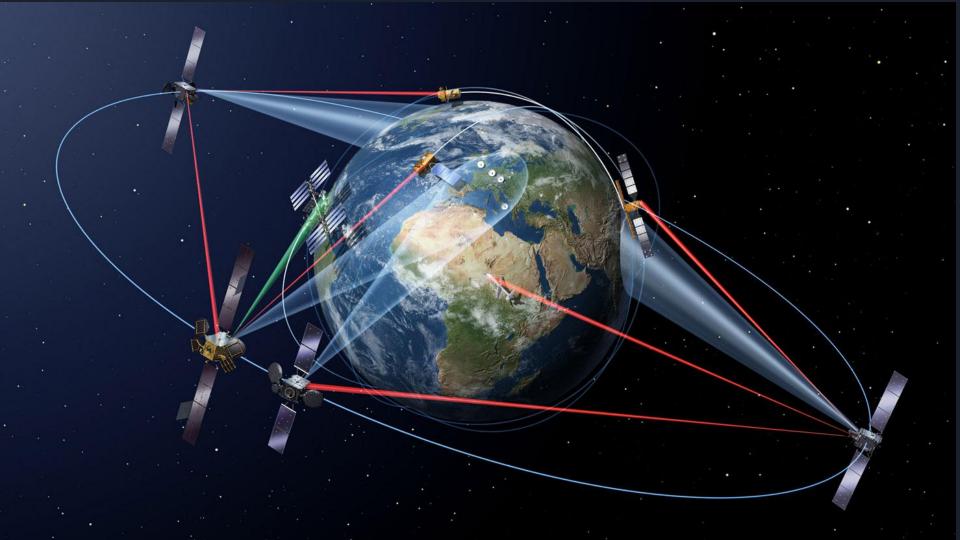
Edoardo Carlesi ¹ *, Yehuda Hoffman ¹ †, Noam I Libeskind ^{2,3} ¹Racah Institute of Physics, Hebrew University, Jerusalem, Israel ²Leibniz Institüt für Astrophysik Potsdam (AIP), An der Sternwarte, Potsdam, Germany ³University of Lyon, UCB Lyon 1, CNRS/IN2P3, IUF, IP2I Lyon, France







... what happens if you point the satellite-borne telescopes in the "wrong" direction?



Multi Spectral Image (MSI) DATA

Directly understandable (RGB)

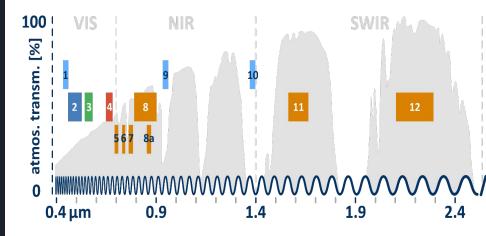
Many different wavelengths (Visible, Near Infra Red, Short Wave Infra Red)

Contra:

Pro:

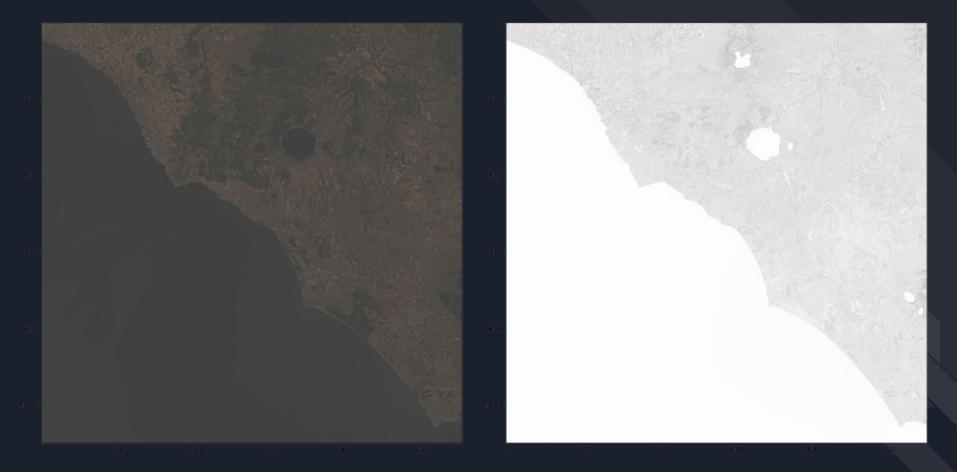
Atmospheric corrections

Clouds



BAND	SPECTRAL	WAVELEN. [µm]	GEOM. [m]	SENSOR
1	aerosols	0.429 - 0.457	60	MSI
2	blue	0.451 - 0.539	10	MSI
3	green	0.538 - 0.585	10	MSI
4	red	0.641 - 0.689	10	MSI
5	red edge	0.695 - 0.715	20	MSI
6	red edge	0.731 - 0.749	20	MSI
7	red edge	0.769 - 0.797	20	MSI
8	NIR	0.784 - 0.900	10	MSI
8a	narrow NIR	0.855 – 0.875	20	MSI
9	water vapour	0.935 - 0.955	60	MSI
10	SWIR cirrus	1.365 - 1.385	60	MSI
11	SWIR	1.565 – 1.655	20	MSI
12	SWIR	2.100 - 2.280	20	MSI

MSI IMAGES: RGB & NIR OF ROME AREA



DIRECT APPLICATION: SPECTRAL INDICES

Using a direct algebraic combination of the bands we can highlight some properties of the terrain:

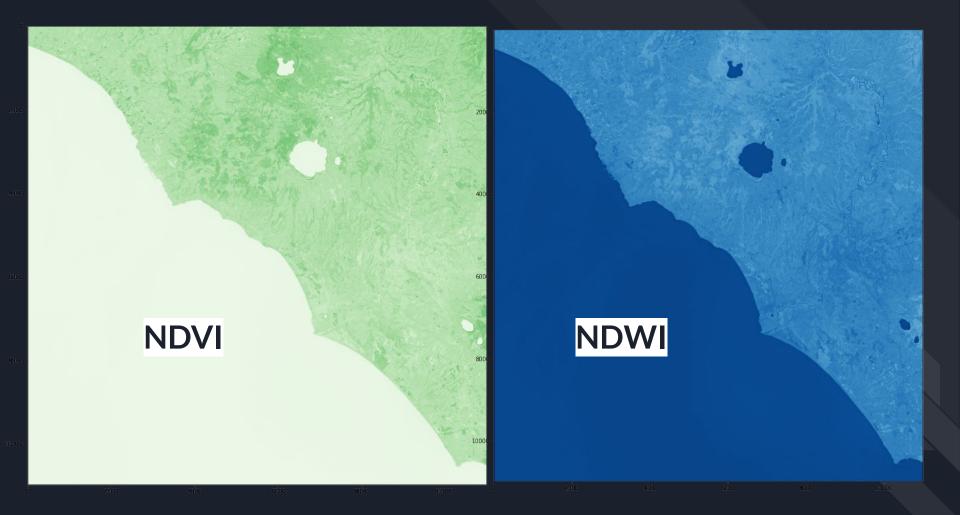
NDVI: Normalized Difference Vegetation Index NDVI = (NIR - RED) / (RED + NIR)

NDWI: Normalized Difference Water Index NDWI = (GREEN - NIR) / (GREEN + NIR)

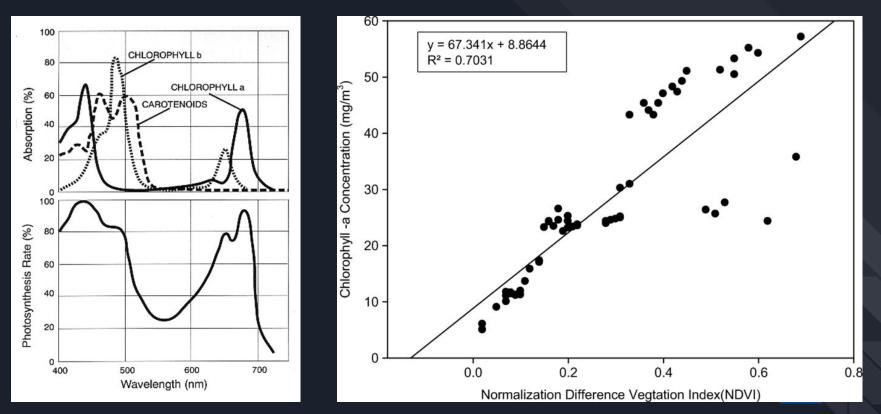
NBR: Normalized Burned Ratio

NBR: (NIR - SWIR) / (SWIR + NIR)

More custom indices: https://custom-scripts.sentinel-hub.com/custom-scripts/sentinel/



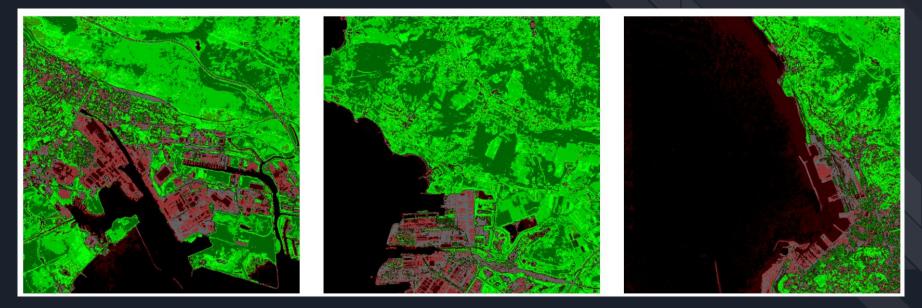
NDVI IS A GOOD PROXY FOR CHLOROPHYLL



Choon et. al (2018) https://www.x-mol.net/paper/article/1213013456713879559

MULTISPECTRAL INDICES & BUILT AREAS

NDVI Range	Feature
-1 - 0	Water, snow, cloud
0-0.2	Barren land / built up /rock
0.2 - 1	Vegetation



NDVI TIME SERIES



Municipality of Comitini (Agrigento), Sicily

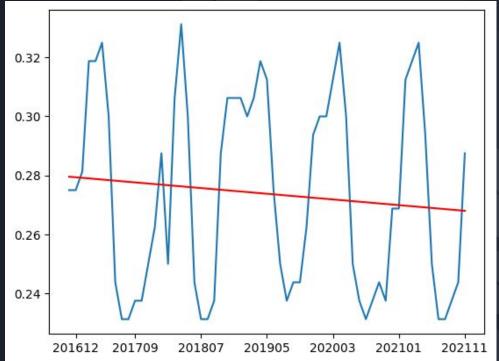


IMAGE SEGMENTATION: U-NET ARCHITECTURE

Base Architecture: UNet/CloudNet with bridge 1024/2048

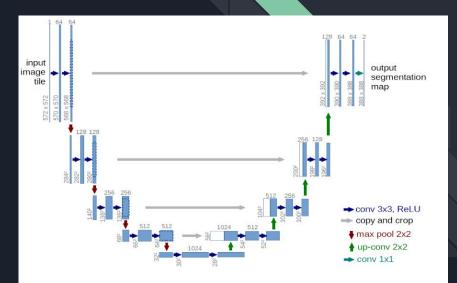
Multiclass: Water, Terrain, Trees, Buildings (ESRI classification, works better under different geo & weather conditions)

Input channels: R, G, B, NIR, NDVI, NDWI

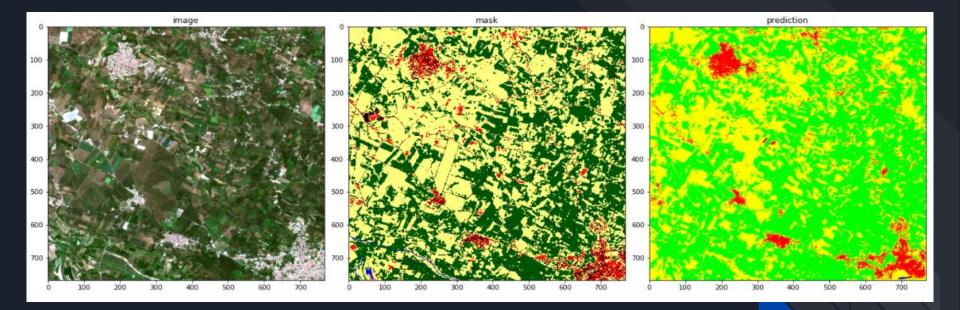
Tensor shape = (Nchannels, Xpatch, Ypatch)

Nchannels = 4, 5, 6

X/Ypatch = 64, 96, 128, 256, 384



TERRAIN SEGMENTATION AND LAND USE



NATURAL HAZARDS: FIRE AND FLOOD

MONITORING

- Continuous and inexpensive
- Identify mostly impacted areas in remote locations
- Direct and orient rescue operations

PREVENTION

- Forecast (real time data)
- Identify risk areas (on historical datasets)

satellite imagery



satellite imagery

DAILY FIRE HAZARD INDEX

Fire hazard can be monitored and forecasted using local meteo data (real time) and satellite data (near real time)

Satellite data provide estimates of live / dry / susceptible vegetation

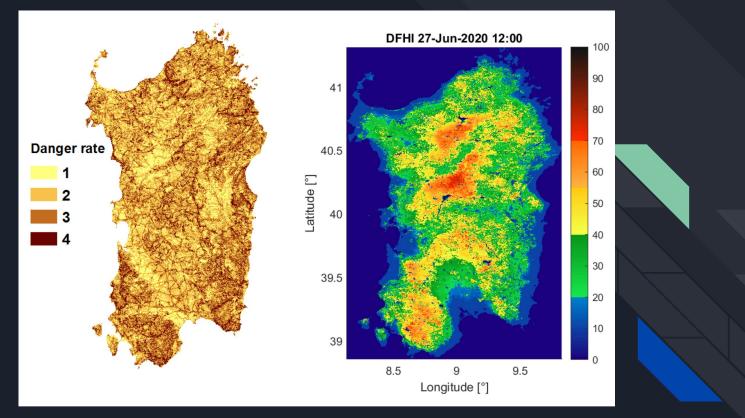
The final expression used to determine the DFHI is the following [55] :

 $DFHI = (1 - L_f)(1 - TN_f) \cdot 100$

where:

- L_f fraction of live vegetation (dimensionless);
- *TN_f* fraction of ten-hours timelag fuel moisture (dimensionless).

FIRE RISK INDEX



G. Laneve et al., Remote Sensing (2020)

... and what about Uranus?

NANOWAR OF STEEL - Uranus feat. Michael Starr (Steel Panther)









SOME STATS

70+M views on YouTube 170k Monthly on Spotify

70+ shows in EU, UK, USA and Canada in 2023 40+ shows in EU, UK so far in 2024

Sold out shows in Italy, Denmark, Germany, Hungary, Austria, Spain, France, Poland, Bulgaria, Switzerland

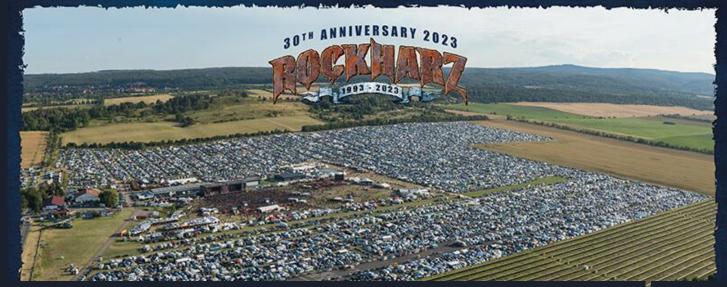
Tens of thousands of albums and T-Shirts sold







CELEBRATING 20 YEARS OF NANOWAR OF STEEL IN MILAN (21.10.2023)



THAT'S IT! NOW I HAVE TO LEAVE TO PLAY A SHOW HERE TONIGHT...





EXTRA SLIDES



REMOTE SENSING THROUGH SATELLITES

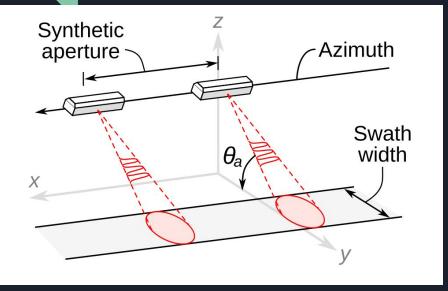
TYPES OF SATELLITE DATA

MULTI SPECTRAL IMAGES (MSI): Passive sensors

(E.g. ESA Sentinel 2 & 3, NASA Landsat 7 & 8) SYNTHETIC APERTURE RADAR (SAR): Active sensors

(E.g. ESA Sentinel 1)

SYNTHETIC APERTURE RADAR (SAR)



Radio beams launched to the Earth

The movement of the satellite "simulates" a large antenna

Image quality / resolution depends on wavelength / polarization

Distortions induced by surface irregularities, different reflecting angles etc.



SAR DATA

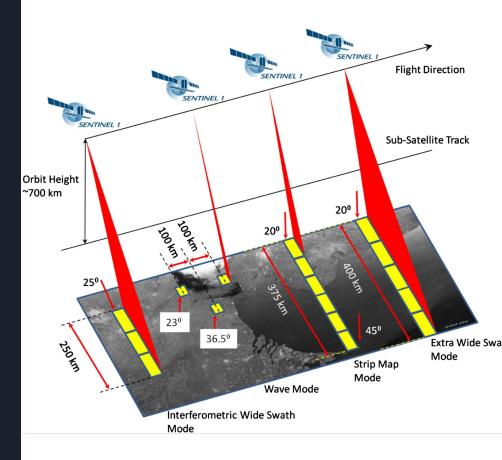
Weather-free measurements

Signal processing through time allows to detect mm-scale variations

Contra:

No true color information (false color with polarization)

Post processing is complex



SAR IMAGES

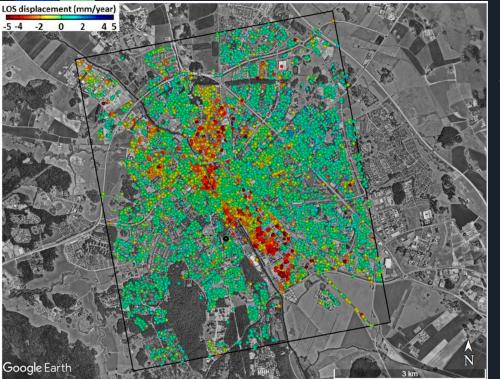
Vertical (V) and Horizontal (H) polarizations in transmission and reception



Image: Sentinel-1A over Brittany region, France VV intensity image, VH intensity image, and RGB color composite

Composite RGB: VV channel for red, VH channel for green, |VV| / |VH| for blue

SAR APPLICATION: SUBSIDENCE



Subsidence is the vertical movement / sinking of the ground (for natural or human induced reasons e.g. groundwater extraction and depletion)

Differential Interferometric SAR data can detect subsidence trends up to a **few mm/year**