

The Golden Age of Geospatial Data Science and Engineering

Geospatial Data Science Distinguished Speaker Series UIUC Department of Geography & GIS Wednesday, February 6th, 2019

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My perspective

- Physics, remote sensing, systems engineering
- NASA weather satellite and information systems
- Standards for science and engineering
- OGC CTO



Mission of the Open Geospatial Consortium

Global forum of developers and users of spatial data products and services

Open international standards for geospatial interoperability.



Source: Space Time Toolkit



Source: One Geology



Source: 3d Stadtmodell Berlin



Basic Geospatial Interoperability Challenge Solved

1000s of Services, 100Ks Datasets Worldwide Implement OGC Standards



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The FOURTH PARADIGM

DATA-INTENSIVE SCIENTIFIC DISCOVERY

EDITED BY TONY HEY, STEWART TANSLEY, AND KRISTIN TOLLE

Science Paradigms

<u>a</u>

- Thousand years ago: science was Empirical describing natural phenomena
- Last few hundred years: Theoretical branch using models, generalizations
- Last few decades: a Computational branch simulating complex phenomena
- Today:
 Data Exploration
 - Data captured by instruments
 Or generated by simulator
 - Scientist analyzes database / files using data management and statistics











Geospatial Data Science

- Increasing data sources and volumes
- Geospatial coverages and analytics
- Semantics and linked data
- Cloud computing
- Machine learning



Progression of Geospatial Information









Region-Centric Geospatial Information

1980s



Human-Centric Geospatial Information 2000s Device-Centric Geospatial Information 2010s



50 billions Internet-connected things by 2020 **Sensors** Everywhere (Things or Devices)



UGU

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Slide source: Steve Liang, Univ. Calgary

Urban Models, Sensors, Applications



Source: http://www1.nyc.gov/site/doitt/initiatives/3d-building.page



CityGML models for 3D visualization and analysis based on semantics

- Urban Planning / Operations
- Emergency Mgt / Response
- Transportation / Logistics
- Indoor navigation
- Retail Site analysis
- Sustainable / Green Communities
- City Services Management
- Noise abatement
- Telecommunications placement
- Many other uses...

Source: Singapore Land Authority, and Geospatial Media

Climate and Weather Observations

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Geospatial Coverages

- Coverage Data Structure
 - "spatial function" or "field"
 - Spatial Domain to Values Range
- Continuous Coverage
 - Positions return a value
 - May involve Interpolation
 - -e.g., predictive model outputs
- Discrete Coverage
 - associate a single value to all positions within a given Geometry Value Object
 - -e.g., imagery, land use







Geospatial Data Cubes

- Data Cube: 4D space/time Coverages; Efficient access and analysis
- Analysis Ready Data: Processed products with methods to reduce burden on users
- Federation based on open standards

http://www.datacube.org.au



Geospatial Data Cube Federation



Earth Science Data Analytics

 Process of examining, preparing, reducing, and analyzing large amounts of spatial (multi-dimensional), temporal, or spectral data encompassing a variety of data types to uncover patterns, correlations and other information, to better understand our Earth.



Discrete Global Grid Systems

"...a spatial reference system that uses a hierarchical tessellation of cells to partition and address the globe. DGGS are characterized by the properties of their cell structure, geo-encoding, quantization strategy and associated mathematical functions."

– OGC DGGS Standard



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Standardising Discrete Global Grid Systems



Unique Cell Indices

• Hierarchy-based, Space-filling Curve, Axes-based or Encoded Address



OGC Moving Features Standard

"Moving features" data describes such things as vehicles, pedestrians, airplanes and ships.



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Moving Features: one trajectory, one geometry

Operations between a trajectory object and a **geometry** object of which geometry is stable



Moving Features: Two trajectories

Operations between two trajectory objects from the spatio-temporal viewpoint

Examples: •*distanceWithin* •*intersection* •*nearestApproach*





Spatial Semantic Web



Observations and Measurements

- OGC SWE* defines
 Observations,
 relevant entities, and
 their relationships
- Syntactic interoperability and Semantic interoperability



*OGC Sensor Web Enablement (SWE) Standards deployed in operational implementations for more than a decade



Semantic Sensor Network Ontology

- An OWL-2 DL ontology
- Relationships between sensors/ actuators/ sampling and observations/ actuations/samplings
- Modular architecture for judicious use of "just enough" semantics for diverse applications
- Aligned with OGC/ISO
 Observations and Measurements

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sosa isFeatureOfinterestOf



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Abstract

The Semantic Sensor Network (SSN) ontology is an ontology for describing sensors and their observations, the studied features of interest, the samples used to do so, and the observed properties, as well as actuators. SN follows a horizontal and vertical modularization architecture by including a lightweight but self-contained core ontology called SOSA (Sensor, Observation, Sample, and Actuator) for its elementary classes and properties. With their different scope and different degrees of accumatization, SSN and SOSA are able to support wide range of applications and use cases, including satellite imagery, large-scale scientific montoring, industrial and household infrastructures, scolal sensing, citizen science, observation-driven ontology and previous below fittings of their display of the previous and previous and previous and previous and previous and the dotted below, and examples of their usage are given.

> The namespace for SSN terms is http://www.w3.org/ns/ssn/. The namespace for SOSA terms is http://www.w3.org/ns/sosa/.

> > The suggested prefix for the SSN namespace is ssn. The suggested prefix for the SOSA namespace is sosa.

The SSN ontology is available at http://www.w3.org/ns/ssn/. The SOSA ontology is available at http://www.w3.org/ns/ssn/.

https://www.w3.org/TR/vocab-ssn/ https://portal.opengeospatial.org/files/74883

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Fig. 2 The possible relations between time periods [AF-97]

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Data Science and Cloud

- Methods, processes, algorithms to extract knowledge or insights from data in various forms, either structured or unstructured
 - Unifies statistics, data analysis, machine learning, related methods
 - "Fourth paradigm" of science: empirical, theoretical, predictive models and now data-driven
- Data Science with Cloud Computing
 - Large Datasets stored in clouds
 - Data analysis using cloud capabilities
 - Python and R



Cloud Computing





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Interoperability and portability between clouds using OGC Web Services



Machine Learning



ImageNet and CNNs

ImageNet Classification with Deep Convolutional Neural Networks (CNNs) Source: KSH, NIPS 2012

ML&AI applied to Geospatial Data





Human-Machine Partnership

"An integrated domain where hunches, cut-and-try, intangibles, and the human 'feel for a situation' usefully co-exist with . . . high-powered electronic aids."

– Douglas Engelbart, 1962

"Perhaps no matter how fast computers progress, artificial intelligence may never outstrip the intelligence of the human-machine partnership."

– Walter Isaacson, 2014



The Innovators of the Digital Revolution



"Most successful innovators had one thing in common: they were "product people". They cared about, and deeply understood, the engineering and design."

"Digital age may seem revolutionary, but it was based on expanding ideas handed down from previous generations."

OGC Tech Trends



Publicly Available at: https://github.com/opengeospatial/OGC-Technology-Trends



OGC Geospatial Tech Trends Priorities

Publicly Available at: https://github.com/opengeospatial/OGC-Technology-Trends



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For Details on OGC ...

OGC Standards

- Freely available
- <u>www.opengeospatial.org/standards</u>

OGC Innovation Program

- http://www.opengeospatial.org/ogc/programs/ip



