

# AGGREGATION OF SEMANTIC SENSOR DATA

Graduation proposal

by

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## ACRONYMS

API	application program interface	3
INSPIRE	infrastructure for spatial information in Europe	2
IoT	internet of things	1
ISO	international organisation for standardisation	2
JSON	javascript object notation	3
μSDI	micro spatial data infrastructure	2
OGC	open geospatial consortium	1
O&M	observations and measurements	4
OSM	open streetmap	3
OWL	web ontology language	7
RDF	resource description framework	3
REST	representational state transfer	2
SensorML	sensor modelling language	3
SEL	semantic enablement layer	4
SOS	sensor observation service	2
SSN	semantic sensor network	1
SSW	semantic sensor web	1
SWE	sensor web enablement	1
W <sub>3</sub> C	world wide web consortium	1
XML	extensible markup language	3



# 1 | INTRODUCTION

This document should include:

- motivation / problem field /relevance
- position in the academic and professional debate
- problem statement, objectives, research questions
- approach, theoretical framework, methodology
- references
- preliminary project set up and results

an introduction in which the relevance of the project and its place in the context of geomatics is described, along with a clearly-defined problem statement

## 1.1 BACKGROUND

Egenhofer (2002) argues "there would exist a much higher potential for exploiting the Web if tools were available that better match human reasoning" (Egenhofer, 2002, p. 1). Sheth et al. (2008) proposed adding semantics to the sensor web which has resulted in the so-called semantic sensor web (SSW). The sensor web enablement (SWE) standards by the open geospatial consortium (OGC) have been combined with ontologies in the SSW to add meaning to sensor data (Pschorr, 2013; Henson et al., 2009). The world wide web consortium (W3C) has contributed to this development by creating the semantic sensor network (SSN) ontology (Compton et al., 2012).

Smart cities can be defined as "enhanced city systems which use data and technology to achieve integrated management and interoperability" (Moir et al., 2014, p. 18). Research on smart cities has identified a number of potential uses for semantic sensor data. Often this is presented in the context of the internet of things (IoT) (Zanella et al., 2014; Wang et al., 2015a). Fell (2014) describes the IoT as "the result of technological progress in many parallel and often overlapping fields, including those of embedded systems, ubiquitous and pervasive computing, mobile telephony, telemetry and machine-to-machine communication, wireless sensor networks, mobile computing, and computer networking" (Fell, 2014, p. 11). Wang et al. (2015a) argues that sensor data fusion plays an important role in the IoT. He defines sensor data fusion as "a data processing technique that associates, combines, aggregates, and integrates data from different sources" (Wang et al., 2015a, p. 2).

To keep up with the developments of the IoT and the smart city OGC has identified the role of their standards in the 'smart cities spatial information framework' (Percivall, 2015). This is in line with the smart city vision of

Townsend (2013) for creating “an organically evolved set of open standards and software that anyone can build on” (Townsend, 2013, p. 290).

The infrastructure for spatial information in Europe (INSPIRE) directive requires the EU member states to provide sensor data about a number of environmental aspects such as air quality, atmospheric conditions and water quality (INSPIRE, 2013). According to INSPIRE sensor data has to be available for citizens to discover, view and download as a service which is free of charge and which uses standards by OGC and the international organisation for standardisation (ISO). However, this development is still work in progress (Kotsev et al., 2014).

## 1.2 PROBLEM STATEMENT

The vision of the IoT and the smart city is very appealing. However, there are still a number of missing links considering the role of the SSW. First of all, current SSW research focusses mainly on sensor data from a single source. It is therefore difficult to discover sensor data on the internet that can be queried using the SWE standards. Second of all, data from different sources cannot easily be shared, integrated, combined and aggregated for data fusion (Wang et al., 2015b; Ji et al., 2014; Corcho and Garcia-Castro, 2010).

To overcome the issues of sensor data discovery and integration Janowicz et al. (2013) suggest a linked data model and a representational state transfer (REST)ful proxy for OGC’s sensor observation service (SOS). They mention future work should focus on the ‘Sensor Plug&Play infrastructure’ in which “sensors can be automatically registered” (Janowicz et al., 2013, p. 21). Also, it is argued that these developments could lead to a micro spatial data infrastructure ( $\mu$ SDI) and will enable an ubiquitous geoweb.

## 1.3 USE CASE

Providing temperature data of all EU member states is part of the INSPIRE program. This data is useful for mapping the effects of extreme temperatures on citizen’s health and the environment. van der Hoeven et al. (2014) and van der Hoeven and Wandl (2015) are examples of studies which aim to identify urban heat islands in cities. These studies require temperature data combined with statistics, based on addresses. This research will be used as an example use case for the added value of the semantic sensor web.

## 1.4 RESEARCH QUESTION

This thesis aims to gain knowledge on how to move the SSW closer to an ubiquitous geoweb by answering the following research question:

*How can the semantic sensor web improve the discovery, integration and aggregation of distributed sensor data?*



## 2 | RELATED WORK

a related work section in which the relevant literature is presented and linked to the project;

### 2.1 SENSOR WEB

OGC SWE standards such as SOS and sensor modelling language (SensorML) (Botts et al., 2007), (Botts et al., 2008)

Different data formats: extensible markup language (XML) (SWE), EXI (W<sub>3</sub>C) and javascript object notation (JSON) SensorThings application program interface (API) (Zanella et al., 2014)

OGC has been working on standards for geodata discovery that allow users to find datasets based on geographic and temporal properties (Goncalves, 2014). It is available as an extension for existing formats like RSS and Atom. However, it does not mention support for sensor data discovery.

Sensor metadata visualisation has been studied by Yoo (2014) in order to improve the discovery of sensor data. How to integrate or combine different datasets is not addressed in this approach.

### 2.2 LINKED DATA

Linked Data (Berners-Lee et al., 2001)

Web of Data Bizer et al. (2009)

Research by Auer et al. (2009) under the name of 'linked geodata' shows how to convert open streetmap (OSM) data into resource description framework (RDF) triplets and publish it in the semantic web. The linked OSM data used to be accessible online at <http://linkedgeodata.org/OnlineAccess>. However, this is no longer the case. They do offer a manual and open source software for publishing OSM data as linked data at <https://github.com/GeoKnow/LinkedGeoData>. Anyone interested in using linked OSM data can refer to this for their own implementation.

Publishing geodata as RDF and mapping on-the-fly (Missier, 2015)

### 2.3 SEMANTIC SENSOR WEB

SSW (Sheth et al., 2008), (de Mel et al., 2011), (Bakillah et al., 2013)

Huang and Javed (2008) add semantics to sensor data, but do not use the SWE standards by OGC.

Extending RDF with the ability to represent spatial and temporal data (Koubarakis and Kyzirakos, 2010)

Janowicz et al. (2010) argue that the current SWE standards are not sufficient for dealing with sensor data on the semantic web. A transparent semantic enablement layer (SEL) for OGC services is proposed that replaces the observations and measurements (O&M) and SensorML standards. This research formed the basis for the development of the W<sub>3</sub>C SSN ontology (Compton et al., 2012).

Henson et al. (2009) and Pschorr (2013) present the SemSOS architecture which adds semantics to sensor data and publishes the semantically enriched sensor data via SOS and the O&M encoding. However, in SemSOS the semantics are not being used to integrate or combine data from different sources, but rather to enrich data from a single source.

Applications using OGC SOS and W<sub>3</sub>C SSN (Keßler and Janowicz, 2010), (Barnaghi et al., 2010)

Three layer model: the sensor data source layer, the data integration layer and the application layer Wang et al. (2015b).

## 2.4 INTERNET OF THINGS

More and more devices connected to the internet. Also a growing amount of research on using sensors of smart devices. (Waher, 2015), (Žarko et al., 2015), (Calbimonte et al., 2011)

Research on connecting smart devices to SSW (de Vera et al., 2014)

OpenIoT platform (Calbimonte et al., 2014)

## 2.5 SMART CITIES

The role of sensors in smart cities (Zanella et al., 2014)

The role of OGC standards in smart cities (Percivall, 2015)

# 3

## RESEARCH OBJECTIVES

the research objectives and/or research questions are clearly defined, along with the scope (ie what you will not be doing);

### 3.1 RESEARCH QUESTION

How can the semantic sensor web improve the discovery, integration and aggregation of distributed sensor data?

### 3.2 OBJECTIVE

Develop a method to semantically link sensor metadata to real world objects for spatial, semantic and temporal data aggregation.

I would like to bridge the efforts by [Henson et al. \(2009\)](#), [Pschorr \(2013\)](#), of adding semantics to [SOS](#), and the efforts by [Auer et al. \(2009\)](#) of adding semantics to [OSM](#) data using the [SSN](#) ontology proposed by [Compton et al. \(2012\)](#) in order to improve the discovery, integration and aggregation of sensor data from different sources.

The thesis research should result in a prototype implementation which consists of two parts:

1. Firstly, an application that takes locations (HTTP addresses) of SOS servers as input and automatically links them to the [OSM](#) data. It results in a(n extended) mapping of the sensor web that will be used by the aggregation queries in the second part of the implementation. However, these mappings between sensors and objects are also freely accessible on the (semantic) web which improves the discovery of sensors for other applications.
2. Secondly, an application that allows users to query aggregated sensor data from different sources. This takes an [OSM](#) feature and a time interval as input, optionally with other spatial/temporal parameters (like a value for a buffer operation or a time interval to aggregate on). It returns a set of aggregated sensor data.

### 3.3 SCOPE

focus on [OGC's SWE](#) standards / [SOS](#) and [W3C's SSN](#) ontology. Not going into evaluation of different standards. Not specifically focussing on smart devices, but on [SWE](#) enabled sensors.



# 4 | METHODS

overview of the methodology to be used;

## 4.1 STANDARDS

### 4.1.1 Sensor Web Enablement

[SOS](#) and [SSN](#)

### 4.1.2 Semantic Web

- Store [OSM](#) data: create [RDF](#) on-the-fly to prevent double storage.
- Retrieve sensor metadata: create [RDF](#) from [O&M](#) which is returned by [SOS](#) `getCapabilities/describeSensor` requests
- Use [SSN](#) as ontology for semantic sensor metadata
- Use web ontology language ([OWL](#)) as language for storing semantic [RDF](#) triples

Query metadata: SPARQL, geo-SPARQL or stSPARQL? and which query engine?

## 4.2 ONTOLOGIES

The [O&M](#) ontology is retrieved from sensors

Use [SSN](#) ontology to store metadata from sensors.

## 4.3 MIDDLEWARE

Creating own middleware to link sensors semantically and retrieve aggregated data

[REST](#)ful service

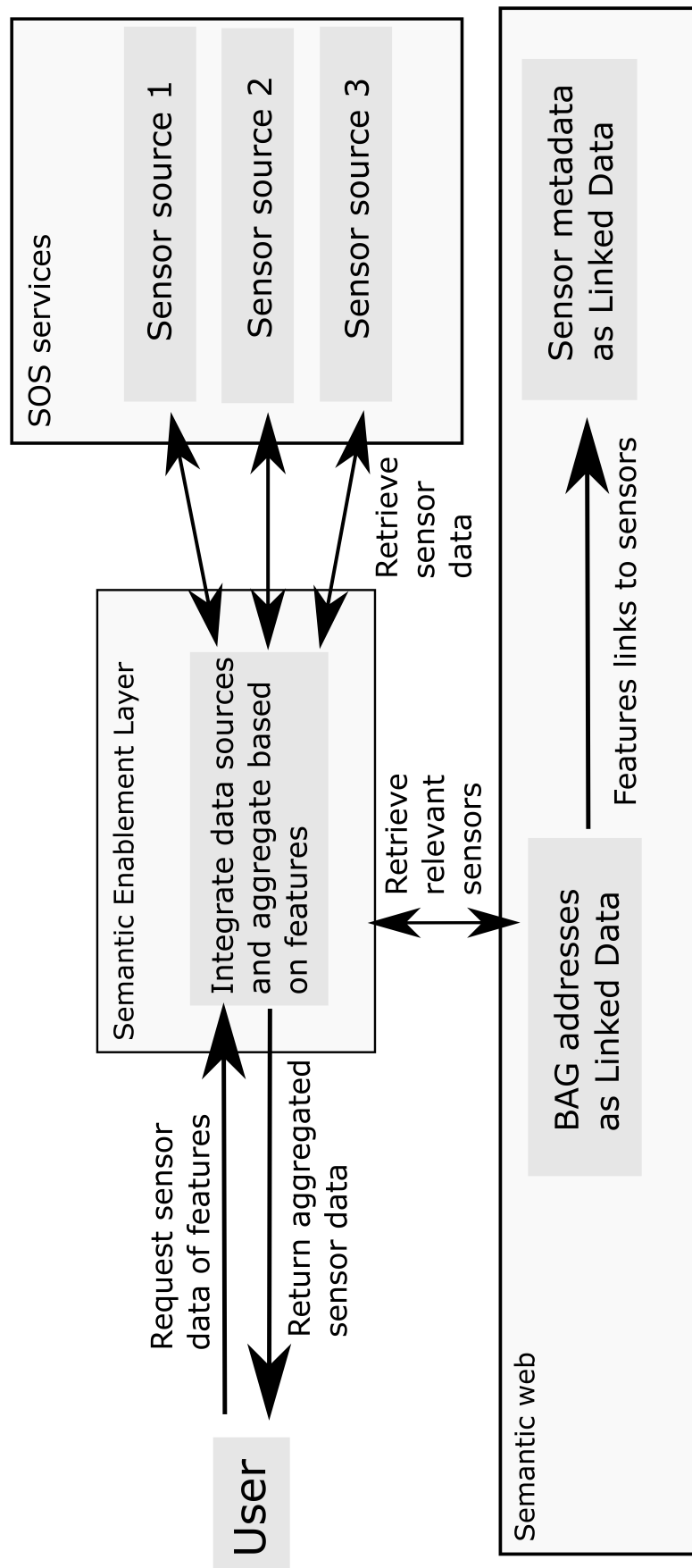


Figure 4.1: Flow chart showing the different components of the implementation

# 5 | PLANNING

time planning—having a Gantt chart is probably a better idea than just a list;

## 5.1 GANTT CHART

# Thesis Planning

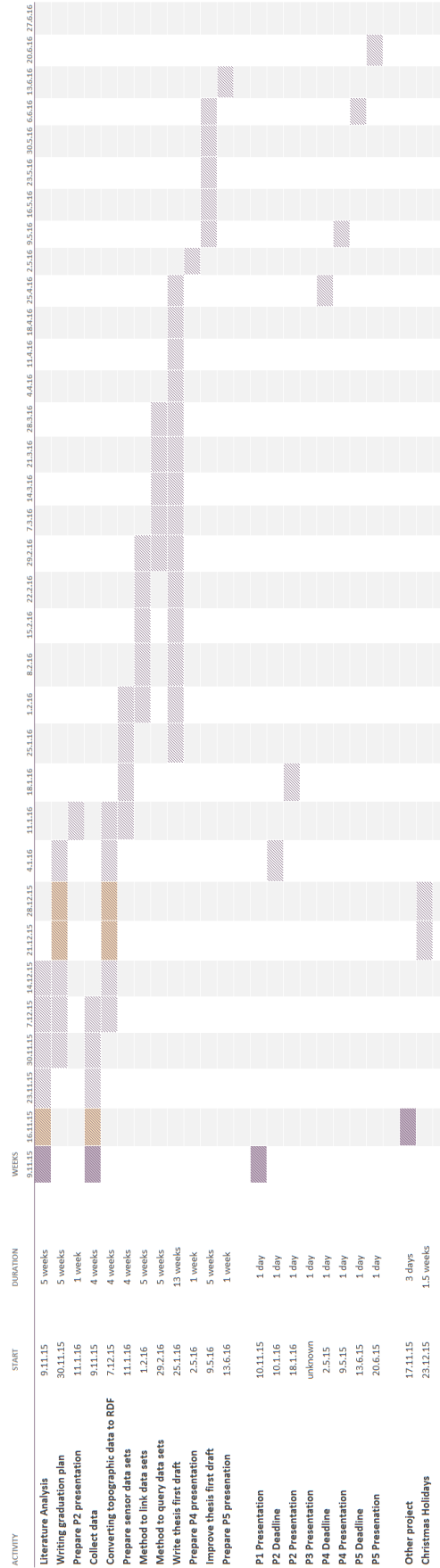


Figure 5.1: GANTT chart showing the planning of the thesis



# 6 | TOOLS AND DATA

since specific data and tools have to be used, it's good to present these concretely, so that the mentors know that you have a grasp of all aspects of the project;

## 6.1 DATA

Topographic data  
Sensor data (different sources)

## 6.2 DATABASE

Oracle?

## 6.3 SERVER

Or localhost?

## 6.4 PROTOTYPE

Use Python programming language and Flask for server sided scripts  
Perhaps with Python's **Request** library for making POST or GET requests.



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