

Semantic City Planning Systems (SCPS): A Literature Review

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Semantic City Planning Systems (SCPS): A Literature Review

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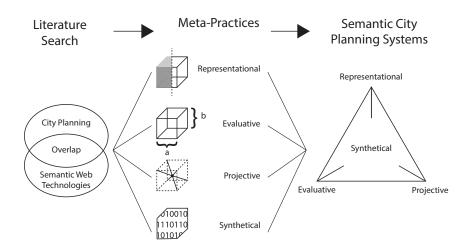
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Abstract

This review focuses on recent research literature on the use of Semantic Web Technologies (SWT) in city planning. The review foregrounds representational, evaluative, projective, and synthetical meta-practices as constituent practices of city planning. We structure our review around these four meta-practices that we consider fundamental to those processes. We find that significant research exists in all four meta-practices. Linking across domains by combining various methods of semantic knowledge generation, processing, and management is necessary to bridge gaps between these meta-practices and will enable future Semantic City Planning Systems.



Highlights

- We collect literature at the intersection of City Planning and Semantic Web Technologies (SWT).
- We structure this body of research along representational, evaluative, projective, and synthetical meta-practices fundamental to City Planning.
- We find that significant research exists to develop Semantic City Planning Systems (SCPS).

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1 Introduction

Rapid urbanisation has seen cities grow in size and number at unprecedented speed worldwide [157]. Beginning in nineteenth-century Europe, evolving in twentieth-century Americas and accelerating exponentially in the early decades of the twenty-first century in Asia and Africa, urbanisation has produced a sharp rise in consumption of energy, land and metals and other raw materials. This, in turn, has increased green-house gas emissions that contribute to climate change [148]. Planning and managing the growth of cities today and in the near future is widely regarded as essential if we are to address the challenge of climate change and the host of associated issues – such as mitigating pollution, food security, and social equity – that underpin long-term liveability and sustainability [141].

Mainstream city planning emerged in nineteenth-century England, continental Europe and the United States alongside urbanisation and industrialisation. It took shape as a rational and public-spirited response to new societal challenges triggered by those processes such as managing pollution, sanitation and public health, providing affordable housing for growing populations, integrating new utilities like gas and electricity, and delivering efficient urban transportation [69, 2]. Planning developed hand-in-hand with new social scientific, statistical and cartographic techniques needed to empirically record the various social, economic and physical aspects of rapidly growing cities [66, 68, 140].

Planning has historically been associated with a top-down reduction in complexity, resulting in a particular plan that is considered a 'solution' satisfying a set of requirements to an agreeable extent *e.g.* a master plan). However, reductionist conceptions of planning often ignore the inherent complexity and interconnected nature of urban systems, in which problems are 'wicked' [130] and the system 'unknowable' [106, 198-201], and 'unsolvable' without acknowledging the complexity of the system [14, 33]. As a result, at present time, planning often emphasises the process of dialogue and consensus building, rather than the product.

The discipline also diversified in response to changing political and social mores in the twentieth century. This saw an increasing multisectoral outlook, with greater involvement of private sector interests and civil society through participatory planning movements. At the same time, a growing interdisciplinarity in planning was accompanied by a tendency towards fragmentation into various sub-disciplinary socioeconomic, environmental and physical design-oriented traditions [60, 68, 121].

The increased pace of urbanisation today and its implication in climate change places new demands on city planning. These demands, which focus directly on the empirical traditions of the discipline, concern improving the credibility, timeliness and diversity of evidence to support the planning of sustainable cities. Harnessing the rise of information communication technology (ICT), big data and artificial intelligence (AI) has been regarded as imperative to meet these demands [154, 156]).

City Planning (CP) has been integrating the growing availability of digital data. The rise of Geographic Information Systems (GIS) and, more recently, agent-based modelling in land-use studies (*e.g.* 'Agent-based modelling of city systems' Systems 2016), and various digital planning support tools e-governance and entrepreneurial governance systems have become central the discipline [11, 26, 145]. Despite these recent advances,

Batty [12], Helbing and Pournaras [70] note that CP has yet to effectively harness the full possibilities of the ICT revolution. The exponential growth in quantity of data on cities and city processes, has been supported by improved capacities to store and manage those data and make them available to city-making stakeholders across the board. And yet, mainstream CP efforts still generally rely on two-dimensional planning maps for land-use zoning, simple ratios to indicate maximum densities, and rigid metrics for environmental performance. Even if these kinds of data are digitised and made available on websites, they remain relatively static, without standardised exchange formats and difficult to cross-reference and analyse [95]. The many new digital tools that have emerged lack, as Dominic Stead puts it, a 'framework for categorizing, analyzing, and comparing' them [145]. Providing such a framework would rely on developing 'a better system of validation and critical assimilation of scientific knowledge' into city planning [107, 267].

There are many possible reasons for the relative hesitancy of city planning to harness digital data. They may concern the way the discipline itself has tended to prioritise the craft of planning rather than tending to its scientific foundations [107]. They may also concern the interdisciplinary and multisectoral character of the discipline which tends to generate distinctive sub-disciplinary specialisations in the face of rising interdependency of social, economic and physical dimensions of cities. They may also concern the data themselves. Although more numerous, big data are typically sourced in many different formats, are stored in distinctive siloes, and managed in inconsistent ways. Big data, in other words, are often unstructured, not linked and provide hurdles to being integrated.

This review focuses on the last of these possible reasons. It does so by focusing on recent developments in the field of Semantic Web Technology (SWT). SWT is an area of innovation in the digital revolution that offers a promising approach to solving the difficulties with data fragmentation and supporting the more effective use of big data in planning. SWT is promising in this context because it focuses on structuring and linking data, making it more searchable and accessible. In the context of CP, it has the capacity to improve the interoperability of data across different sectors, disciplines and knowledge domains.

For the purposes of this review, we define CP in section 3.1 as a complex task that requires four Meta-Practices (MP) that occur simultaneously during CP processes: *Representational MP*, *Evaluative MP*, *Projective MP*, and *Synthetical MP*. Our purpose is to better support planning practice, and its ability to address the challenges of urbanisation, demographic shift and climate change with Semantic City Planning Systems (SCPS) at the intersection of CP and SWT – see Fig. 1.

In section 2 we provide a short overview of digital urban planning and describe how SWT present opportunities for CP and how planning-related knowledge is represented in this context. We explain and define SCPS as a necessary endeavour for future CP in section 3. We define the scope of this literature review in section 3.1. Section 3.2 describes how we built the body of literature of this review. We take a particular interest in planning support tools or systems and the digital artefacts used to support them. We arrange the found literature and uncover research gaps that we present in section 4. We structure our findings along four MP with section 4.1 on Representational MP, section 4.2 on Evaluative MP, section 4.3 on Projective MP, and section 4.4 on Synthetical MP. We discuss and unify the found research niches under SCPS in section 5.

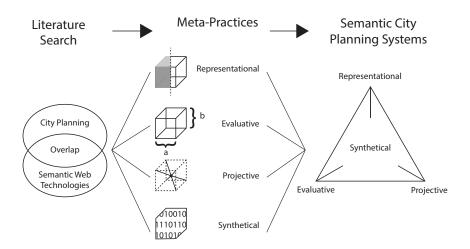


Figure 1: The literature found at the intersection of City Planning (CP) and Semantic Web Technology (SWT) is structured along four meta-practices forming Semantic City Planning Systems (SCPS).

2 Background

This background section situates three main domains that form the foundation of SCPS: SWT in subsection 2.1 and their potential for CP, concepts of knowledge representation of planning and design processes in subsection 2.2, and an overview of the diverse state of the art of digital urban planning in subsection 2.3. These three background subsections help to locate similar research based in SWT in section 4.

2.1 Semantic Web Technologies (SWT)

SWT are built on the concepts of linked data and semantic web. Linked data is data that is structured and interlinked with other data. The semantic web aims to make data on the web machine-readable and interpretable [2, 23]. Semantics relate to the study of meaning, reference, or 'truth' [1], and can be formulated mathematically based in descriptive logic. The semantic web builds on the availability, accessibility of, and the *relationship among*, data [2]. SWT are already transforming the Architectural, Engineering, and Construction (AEC) industries [124]. SWT enable the representation of complex systems forming ever larger connected webs. SWT can facilitate to represent everything of interest or subsets thereof (*i.e.* the world and subsets thereof, such as cities). Machine-readability, scalability, and indifference to the subject of representation promise to overcome current challenges in digitalising CP, namely: the problem of interoperability of data and thus machine readability, the problem of scalability in the face of large and complex systems such as contemporary cities, and the possibility to represent any desirable aspect of cities.

The following terms are crucial in understanding SWT and their potential for CP:

• Knowledge Representation and Semantics

By virtue of representing data and the relationship among them, based in descriptive logic, SWT enable more integrated knowledge representation. Semantics can be used to infer information from linked data and allow to set axioms or principles that define knowledge in specific domains.

• Applied Ontology / Knowledge Domains

An ontology represents a common vocabulary that is necessary for data and relationships among them to be understandable, meaningful and replicable. Vocabularies may differ from one knowledge domain to another in detail and complexity. In addition to a consensus vocabulary of concepts, an ontology is also a consensus categorisation and a consensus hierarchy of concepts. Ontology development may use abstraction and invoke other (sub-)ontologies to describe specific knowledge domains. Web Ontology Language (OWL) is commonly used as knowledge representation language (schema) of the semantic web. Once a knowledge domain is identified, one can design, define, and compose ontologies for many different applications and purposes.

• (Semantic) Triples / RDF / Graph Databases

Information in the semantic web is stored in triples of 'subject, predicate, object' to describe the data and the relationship among them. Each triple can thus link to others, forming a web. Resource Description Framework (RDF) is the data modeling framework for the Semantic Web. For semantic CP, it is thus crucial to represent urban data (geo-location, 3D geometry, textures, attributes, dynamic data, *etc.*) as RDF files. SPARQL is a query language for semantic webs designed to query data across systems and data-bases.

• Knowledge Graph

If data is represented as a node, and the semantic relation, guided by the common vocabulary or ontology, as their edge, then semantic webs can be represented as mathematical graphs of semantic triples. Knowledge Graphs (KG) represents the full integration of data and web structure of a semantic system. Inference as the process of reasoning over data through rules allows to extract, fuse, recombine, and represent knowledge. KG have a wide range of applications grounded in the capacity to infer new or previously inaccessible knowledge. For CP this promises to overcome the fundamental challenges associated with current digital planning of 'siloed' expertise; fragmented, incomplete and inaccessible data; ill definition and large scale of problems [122]. KG can for example enable a multi-scalar and multi-domain simulation [47, 123] and the instantiation of Parallel Worlds (PW) scenarios [48].

• Dynamic Knowledge Graph / agent systems in KG

Dynamic Knowledge Graphs (DKG) are systems that can reconfigure the graph structure dynamically, in response to changing context, to new queries, or to their own increased knowledge, by way of multi agent systems embedded into the KG structure. Examples include industrial process engineering and chemistry processes represented with Artificial Intelligence (AI) composition agents to reconfigure the KG as needed [52, 173].

2.2 Methods for Design Synthesis

Marshall [106, 192] argues to recognise "the positive benefits of a complex system of planning, capable of generating functional urban complexity". CP is inherently interdisciplinary with implications on design [108]. The adage that planning deals with the basic question 'How much of what goes where, and why?' [72, 25] illustrates that the decisions guided by planning relate to the allocation of resources in urban space. CP necessarily works towards multiple objectives, establishing satisfactory syntheses that integrate information from multiple knowledge domains. Urban designers and planners have developed a wide range of strategies to design and manage urban projects. However, the traded formats of conventional design delivery, namely images, plans, calculations, and models, arguably lack standardised formats to evaluate them. In this subsection we will list some attempts to explicate design processes and to link them to computational methods.

• Design Heuristics

In practice, designing and planning are routed in heuristic approaches and tacit knowledge formation that designers and planners acquire in their education and by experience. These increase the domain knowledge and expand the solution space for a design problem [103]. Designers move from abstract idea elaboration and opportunity-seeking 'design freedom' to gradually more concrete solutions and reduction through decision-making 'design solutions' [103]. Such knowledge based in human creativity is hard to systematise and replicate with computers. Hence, the aim of so-called 'computational design' is to enhance the work of designer with digital methods and tools.

• Urban Elements

First attempts to synthesise urban phenomena in 'pattern languages' and to collect them in thesaurus-like manner were made by Alexander [5], Alexander et al. [6]. Alexander's concept to draw urban information from observation and to infer 'rules', 'elements', or 'actions' for urban knowledge has been revisited by Cairns and Tunas [27], Lehnerer [97], von Richthofen et al. [161]. Quickly, any system of elements requires a meta-system, structure or milieu to be embedded in. Thesauri, such as 'rules', 'elements', or 'actions', can share similar aims and structures as ontologies do in SWT.

• Design and Shape Grammars

Shape grammars developed by Stiny and Gips [146] consists of shape rules and generation mechanisms to create complex forms. Shape grammars can we used to explicate design processes. Shape grammars lead to the development of powerful 3D digital modelling tools. These tools based in procedural form generation [113]. These tools can assist in the automatic and procedural generation of large urban models based in urban development guidelines and zoning codes [160].

• Design Space Exploration (DSE)

Design Space Exploration (DSE) is a concept deriving from futurology aiming to describe potential future event spaces and scenarios resulting from decisions in the

past [71, 162]. Similarly, planning can be seen as a temporal process of causal relationships in which data and information is gradually combined to form a *better picture* for decision making: CP unfolds in stages, creating, exploring, and evaluating possible design options, so called design spaces. DSE has been formalised by Fuchkina et al. [56], Pimentel [125].

2.3 Digital Urban Planning

Digital urban planning forms a subset of CP and refers to modelling urban systems and urban forms, developing GIS, planning support systems, and spatial decision support systems, as well as City Information Modelling (CIM) tools.

• Urban Modelling

A first dynamic digital urban model for systems analysis as a tool for urban planning has been developed by Forrester [55]. Forrester suggested to look at urban systems as dynamic interplay of economic, spatial, and social aspects and to model these mathematically for urban simulations. Michael Batty and others built upon the work of Forrester to develop urban analysis models [10, 13].

• Geographic Information Systems (GIS)

GIS allow to represent 3D geographic information digitally [153]. While a range of geo-processing methods are available to analyse and synthesise information, the data-format is limited in its capacity to store and link data.

• Modelling urban form

3D digital modelling of urban forms is concerned with the generation of large and detailed urban geometries. Modelling urban form is based in the study of urban typologies (*i.e.* of buildings, street patterns, densities, *etc.*) and the observation that smaller forms are nested in larger forms following certain structures (buildings group to form blocks, neighborhoods, and precincts, *etc.*). Research focuses on the assembly of rules of typologies and structure to arrive at generative design of urban forms [15, 86]. The rule-based approach to urban modelling has been fast forwarded by Machine Learning (ML) techniques [34, 142, 163]. As König et al. [85] noted, the combinatorial possibilities of automated form generation quickly outpace the possibilities of computers.

• Planning and Decision Support Systems

Planning and decision support systems are a collection of spatial analytical and simulation tools that allow to display (live) geo-spatial and temporal data about cities. These systems often have a 'dashboard' visual interface similar to a military 'situation room' allowing decision makers and stakeholders to visualise, discuss and decide [58, 67, 145].

• Digital Urban Twins

Digital twins complement planning and decision support systems with a virtual 'twin' or model to be used for the analytical and simulation work. Digital twins often incorporate large 3D urban models and link these to other city data bases such as cadastral information and census data [134]. Examples of digital twins include Centre for Digital Built Britain and University of Cambridge [32], CIVAL [39], and the digital twin for the city of Zürich [138].

• City Information Modelling (CIM)

City modelling has been focusing on modelling form and texture for city models that cater to visual applications ranging from navigation, to computer games, cinema, and virtual urban models. City Information Modelling (CIM) emphasises the information aspect and aims to include other data sources such as cadastral information, socio-economic, climatic, environmental, traffic and other data into comprehensive urban models [59]. Challenges to CIM include the problems of lacking data-interoperability and hindered machine processing. For this, CIM are gradually including SWT to overcome these problems [147].

3 Methodology

In this paper, we argue that SWT is particularly suited to support the synthetic, multidomain goals and tasks of CP. However, as the concept of planning is broad and diverse, the corpus of literature representing the intersection of semantic web and planning literature is fragmented. In order to develop a clearer picture of relevant literature, the present section introduces and uses the term SCPS to indicate possible interfaces between planning and SWT. From this definition, we develop a framework for SCPS to help define the scope of a search through literature, in order to build up a collection of relevant literature.

3.1 Defining and Scoping SCPS

We define SCPS as 'possible uses of SWT to support the process of CP practice'. The practice of planning happens at many different scales, resulting in many related terms, such as regional planning, spatial planning, urban planning, town planning, master planning, infrastructure planning, or urban design, amongst others. Planning is also performed for particular subsets of domains, often systems, *e.g.* transportation planning or sanitation planning, and in professional categories, *e.g.* architecture, landscape architecture, civil engineering, or urbanism. In essence, every one of these disciplines represents a planning process related to cities. We argue that despite the immense variety of activities involved in planning practice, all are essentially anchored in meta-practices – representational, evaluative, projective – in addition to knowledge management as synthetical meta-practice. Knowledge management was previously implicitly incorporated into the representational, evaluative and projective meta-practices. As it is now being enhanced by ICT, big data, and AI a new area of synthetical meta-practice is necessary – and analogous to the SWT approach. As we defined SCPS as the use of SWT *to support* CP processes, we developed a framework of four meta-practices (MP). These MP are common to all

planning processes and are meant to facilitate navigating the conceptual space of planning and our scoping of and search for literature and not as mechanical planning devices. They are inherently interconnected and occur simultaneously and not in a particular order.

- **Representational MP** is the act of representing urban systems (*i.e.* urban environments and their parts and processes). These representations are most often visual in nature. Representational MP can be of an entire urban systems or parts of it, representing the totality of that system (*e.g.* 'digital twins') or a selection of its properties (*e.g.* 3D models, maps, evaluation results, ...).
- Evaluative MP is the act of evaluating properties of an urban environment, determining whether they satisfy particular requirements or accomplish goals. Evaluative MP can assess various aspects of urban systems, such as single states (*e.g.* calculating the permeability of street networks), continuous property changes (*e.g.* measuring temperature over time), processes (*e.g.* simulating carbon emissions), or multiple criteria (*e.g.* a SWOT analysis of a site and its properties).
- **Projective MP** is the act of creating specifications of new urban systems or their parts, based on an envisioned or desired (future) urban system or its properties. Projective MP can be performed at many scales (*e.g.* regional plans, master plans, urban design proposals, transport plans), and are often proposed adaptations of existing urban systems.
- Synthetical MP is the act of managing, gathering, using, creating, and synthesising data, information, and knowledge about the urban systems that are planned. Though perhaps not often explicitly mentioned, planning processes inherently rely on flows of information, involving actions such as gathering site information, requesting data from various instances or specialists, retrieving past proposals or decisions, documenting processes and methods, building data repositories, or communicating with stakeholders.

3.2 Building a Collection of SCPS Literature

This literature review looks into the body of literature that is the intersection between literature on SWT and literature on CP. However, it was not feasible to develop a standardised or systematic approach to search for and analyse the body of literature at this intersection, for two main reasons. Firstly, as discussed in detail in section 3.1, both SWT and CP are umbrella terms that cover a broad range of concepts and applications. Secondly, both SWT and CP feature words and terms that are ubiquitously used, making it difficult to delineate a corpus of literature through conjunctive keyword queries. Words related to 'city' or 'urban' are very common; the same is true for terms related to 'planning', and the conjunction of related terms. In case of SWT, particular key terms are also used in other fields, such as 'semantic', 'ontology', or terms related to 'knowledge', without referring to SWT in particular. Considering these limitations, our collection of SCPS literature is not intended to be exhaustive. However, the selected body of work allows us to review the topic, provide an overview existing results, discuss different sub-topics and the weight of their coverage, and identify research gaps. We searched for relevant literature in multiple repositories, using several approaches, the combination of which resulted in a collection of SCPS literature, which we discuss below. The collection for this literature review was built drawing on:

- The authors' pre-existing collection of literature (being researchers studying SCPS).
- Various conjunctive keyword queries in Scopus and Google Scholar, exploring the intersections of particular topics (each 'topic' represented by a set of related terms):
 - 'City Planning' AND 'Semantic Web Technology'
 - 'Planning' AND 'Semantic Web Technology'
 - 'City' AND 'Semantic Web Technology'
 - Each of four 'Meta-Practices' AND 'Semantic Web Technology'
- Keyword searches for terms related to SWT in CumInCAD (a repository of key conferences and journals related to computer aided architectural design).
- Papers suggested by Google Scholar and ResearchGate's recommendation engines.
- Manual crawling of bibliographies and citation chains from particularly relevant papers.

While searching the literature, all sources about 'the use of SWT to support the process of CP' (*i.e.* SCPS) were manually selected for our review collection. Collection items were manually labelled with each of the four MP featuring in the item.

Some of the topics included in our scope and selection do not explicitly mention SWT and CP, nevertheless demonstrate the potential use of SWT to support CP processes. For example, we included key papers about the use of SWT in AEC industry, as it is strongly related to planning, and deals with similar or analogous tasks and problems. In other cases, only a subset of a topic's literature relates to SWT. For example, a large part of the body of research on city information modelling format CityGML does not directly relate to SWT, despite its core structure being inherently semantic and ontological [62] and its next version [91] demonstrating a much closer connection to core SWT practices (see also section 4.1). Also included are sources about planning supported by proto-technologies predating SWT as a field. Even though literature in the field of planning is often related to multiple and interrelated aspects we chose the strongest contributing argument to classify the literature in a respective section. In this article, literature thus appears only in one MP.

4 Reviewing the state of the art of SCPS

We structure our review of the state of the art of SCPS per MP and collect the literature in four sections and tables. Each section starts by introducing relevant application domains and the contributions to SCPS identified in the literature. The tables in each section are organised by domain, contribution to SCPS, and source.

4.1 Representational MP

The following section covers the Representational MP, presented in Table 1. We identified 'foundations' and 'applications' of SCPS Representations:

- Foundations (Table 1, part 1) include BIM-GIS integration to improve interoperability and enable cross-domain representation from one sphere (*e.g.* AEC) to another (*e.g.* cities and geoinformation). The integration and linking of dynamic data aims to capture temporal and periodic data coming from Internet of Things (IoT) data or big data. The visualisation of non-spatial data – such as concensus data or metadata – is of growing interest. Semantic enrichment is concerned with adding meaning to data in a new context and domain of application (for instance BIM data in a GIS environment) and to allow for semantic querying. The foundations also include representation standards based in 202 [3].
- Applications (Table 1, part 2) relate to the development of city models with various functionalities, for instance various Level of Detail (LoD), additional city information, and dashboard compilation of 'vital signs' to assist CP and management. The idea of a 'world avatar' is arguably the widest concept to represent 'everything' of interest to an urban model based on SWT.

The literature grouped in this section covers fundamental aspects of representation. Owing to the spatial and temporal character of urban data, literature in this section covers aspects of geo-spatial representation based in GIS, building systems representation based in BIM, and urban representation based in CIM. These three representational spheres come with standards and protocols of representation that emerged from the specific application range. A large number of papers address the inter-linkage between these spheres. We find that technical aspects related to semantic representation are being addressed for specific domains of AEC and across industries (energy, transport, urban form, etc.), but that the linkage of several domains is still lacking. Within the Representational MP, modelling standards need to be developed further to fully integrate and operate across various scales and industries (e.g. from BIM to CIM to GIS) towards a better semantic representation of cities. CityGML, as the most advanced standard for city data (geospatial and other), and defined semantically, appears to be strongly suited to integrate SWT into a 'Cities Knowledge Graph'. The representation of semantic data in real time and in a 3D virtual environment is possible. Visualisation of various LoD can be achieved that demand further ontological description, e.g. when spaces are found within buildings and these spaces contain further objects, etc.

Domain	Contribution to SCPS	References		
	Foundations of SCPS Representation			
BIM-GIS Data	Improve data interoper-	Biljecki et al. [20], Donkers et al.		
Integration and	ability and conversion, en-	[46], Hor et al. [74], Konde et al.		
Representation	able cross domain repre-	[88], Tauscher et al. [150], Wang		
	sentation	et al. [165]		

Table 1: Literature for the Representational MP.

Continuation of Table 1		
Domain	Contribution to SCPS	References
Representing Dy- namic Data	Integration of domain data, linking data, graph transformation, data population	Chaturvedi and Kolbe [35], Row- land et al. [132], Tempelmeier et al. [152], Yao and Kolbe [169]
Representation Standards	Modelling standards and specifications for repre- sentation in CityGML and CityJSON	Kumar et al. [90], Kutzner et al. [91], Stadler et al. [144]
Semantic Enrich- ment for Repre- sentation	Semantic enrichment of models, create domain on- tologies, spatio-semantic coherence, semantic inte- gration, semantic queries	Billen [21], Lim et al. [99], Schwab et al. [139], Wang et al. [166], Yao et al. [168]
	Applications of SCPS R	
City Dashboards	Dashboard overview, Dashboards for creation, evaluation and data visualisation	Chen et al. [38], Santos et al. [136]
City Models	City model representation, informing domain ontolo- gies, spatial ontologies, support LODs, applica- tions, standards, visualisa- tion	Billen et al. [22], Bonduel et al. [25], Chaturvedi et al. [36, 37], Julin et al. [77], Li et al. [98]
Digital Twins	Support urban develop- ment and land manage- ment use cases, design op- timisation	Boje et al. [24], Montenegro et al. [115]
World Avatars	Build a 'World Avatar' en- vironment	Eibeck et al. [48], Sabag Muñoz and Gladek [135]
End of Table 1		

4.2 Evaluative MP

The literature for the Evaluative MP is organised in Table 2. We group the literature in this section according to the various states of evaluation: single or multi-criteria; monitoring; and modelling.

• Single or multi-criteria evaluation assesses to what extent one or more characteristics of an urban system have reached a certain target. Spatial decision support and design support systems typically require more than one criterion to be assessed. Multi-criteria evaluation is also applicable to other complex assessment and reasoning tasks as well as to the development of ontologies.

- Monitoring refers to reporting and evaluating data-streams (solar irradiation on building surfaces, for instance). Monitoring allows to link various data streams, for instance social media data and big data, and feeds into platforms for urban analytics and semantic data integration for CIM.
- Modelling and Simulation refer to assessing time frames within which states change (for instance the status of an urban lot that changes from 'vacant' to 'construction' to 'built up'). Modelling tackles dynamic data integration as way to represent the multiple and temporal data-streams. Modelling for urban micro-climatic analysis as well as systems modelling are cited use cases.

Dynamic and complex systems such as cities and their subsystems constantly change states. The states and rates of exchange need to be evaluated, monitored and modelled to allow for control and feedback. Single or multi-criteria evaluation allows to determine particular states at given times. Monitoring involves a temporal dimension that allows to observe and evaluate changes in states. This can involve sequential single or multi-criteria evaluations or parallel observations in different locations. Evaluation modelling aims to replicate the interplay of particular states, their change in time and space, as well as their interrelations. The Evaluative MP shows that literature exists to support and inform CP tasks. This section links to the Representational MP – as results of an evaluation can be used to augment representation.

Domain	Contribution to SCPS	References
Single or multi-criteria evaluation		
Decision support	Spatial decision support, design support systems, form-based assessment, qualitative comparative analysis	Lee et al. [96], Miltiades and An- gelides [112], Verweij and Trell [159]
Semantic assess-	Semantic environmental	Kamsu-Foguem et al. [79], Lai and
ment	assessment, verifica-	Zoppi [93], Massaro et al. [109],
	tion, formalisation and	Trento [155]
	evaluation	
Sustainability as-	Graph-based ontology rea-	Kamsu-Foguem et al. [79], Kardi-
sessment	soning, environmental as-	nal Jusuf et al. [81], Konys [89], Lai
	sessment of urban energy	and Zoppi [93], Lombardini [102],
	usage, reduction in CO ₂	Madrazo et al. [104]
	Monitoring	,
Dynamic data	Analysis of social media	Gao et al. [57], Pittaras et al. [126]
evaluation	content, semantic enrich-	
	ment of big data	
Evaluation plat-	Platform for urban analyt-	Psyllidis et al. [129], Yao et al.
forms	ics and semantic data inte-	[170]
	gration for 3D city models	
Modelling and Simulation		

Table 2: Literature for the Evaluative MP.

Continuation of Table 2		
Domain	Contribution to SCPS	References
Process data eval- uation	Temporal data, spatio se- menantic modelling, for 3D city models	Kaňuk et al. [83], Schwab et al. [139]
End of Table 2		

4.3 **Projective MP**

The literature for the Projective MP contains the least number of references - and we identify a clear lack of literature here. We attribute this to the fact that creation in design and planning processes is still under-researched and ambiguous [42]. To overcome this problem, systems of design or design frameworks have been developed [41]. Design Space Exploration (DSE) stands out as a strategy for automated exploration, evaluation, and optimisation of design solutions. Automated creation includes generative computational urban design and planning approaches. The linkage between shape grammars for urban form generation and ontologies promises to automate urban form generation. These examples can be translated, in parts, to machine processes, including advances in replicating complex cognitive tasks such as creativity. The literature organised in Table 3 thus refers to generative processes of creating data, information and knowledge related to planning. In terms of CP, substantial efforts are put on the creation of the physical world, linking in geographic information, 3D geometry, attributes, etc. This MP also includes papers focusing on buildings rather than cities. We include these as the research findings are transferable. The table is not further subdivided as other tables for lack of literature found.

Domain	Contribution to SCPS	References
DSE frameworks	Systematic and automated	Engel [49], Lin [100]
	design space frameworks	
	including temporalities	
	and complexities	
Generative	Generative computational	Montenegro and Duarte
design systems	urban design and planning	[114], Montenegro et al. [116]
Scenario design	Ontology-based platform	Eibeck et al. [47]
	for cross-domain scenarios	
	in process industry	
Semantic design	Ontologies and shape	de Klerk and Beirao [44], Grobler
systems	grammars towards seman-	et al. [63]
	tic design systems	
Semantic evalua-	Semantic analysis and cre-	Armeni et al. [8], Caneparo et al.
tion and creation	ation	[30], Gomes et al. [61]
tools		

Table 3: Literature for the Projective MP.

Continuation of Table 3		
Domain	Contribution to SCPS	References
Semantic enrich-	Semantic enrichment of	Bonduel et al. [25], Calabretto et al.
ment	3D city models, ontology	[28], Mai et al. [105], Wagner et al.
	alignment in the urban do-	[164], Wiegand [167]
	main	
End of Table 3		

4.4 Synthetical MP

The literature is organised in Table 4. This section contains the most references found at the intersection of SWT and CP. The synthetical MP that involves knowledge management enables data interoperability because all data is represented in ontologies that represent the semantic meaning of the data, rather than just their values. It further enables computational interpretation and synthesis, because all data is has semantic meaning that is machine readable. It promises to open up advanced planning support options, such as parallel simulation of multiple scenarios, automated generation of visualisations and analyses, knowledge inference, and iterative learning.

The Synthetical MP provides a clear foundation for SCPS: linked data allows to perform context-based and network proximity analysis; data structuring forms the base for self-organisation of knowledge bases; fundamental challenges of data interopreability can seemingly be resolved. The management of large and complex 3D urban data appears possible with the application of semantics to spatial concepts, urban modelling, communication, decision support, and knowledge generation. Further knowledge domains can be linked in via ontology development techniques and frameworks. We structure this section into Linked Data and Data Processing; Development of Domain Ontologies; Searches and Information Queries; and Processes, Systems, and Agents.

- Linked Data addresses the core challenge of interoperability from a knowledge management perspective. It covers context-based data detection, dynamic data, spatial granularity, and management.
- Semantic Knowledge Management covers semantic strategies for enrichment and spatial data integration.
- Development of Domain Ontologies follows similar topics with a focus of ontology creation and applications arising from it. These include knowledge generation, semantic design and decision support, semantic urban models and semantic urban planning.
- Searches and Information Queries relate to data structuring, as well as semantic querying and answering as methods to infer knowledge based on the descriptive logic of SWT.
- Processes, Systems, and Agents gathers literature around dynamic systems, agent compositions and systems architecture. Together, they support Dynamic Knowledge Graphs (DKG) for cross-domain scenarios or Parallel Worlds (PW).

Domain	Contribution to SCPS	References
	Linked Data	a
Context-based data	Context-based ontologies for urban data, semantic change detection, linked data vocabularies	Hoare et al. [73], McGlinn et al. [110], Med and Křemen [111, 111], Pittaras et al. [126]
Data structuring	Data structuring, develop- ment of knowledge bases, self-organisation	Chen et al. [38], Lin [101], Zhang et al. [171]
Dynamic data	Spatial granularity, dy- namism, representation of data	Chaturvedi et al. [36], Espinoza- Arias et al. [50], Fonseca et al. [54], van Dam and Keirstead [158], Zhang et al. [171]
Semantic exten- sion of data	Interoperability, extension, integration and linkage of data	Métral et al. [118], Psyllidis [128]
Spatial semantic data	Spatial semantic planning databases, ontology- driven GIS, access methods and dynamic database extension	Karalis et al. [80], Yao and Kolbe [169]
	Semantic Knowledge N	Management
Management of semantic data	Management, analysis, and visualisation plat- forms for semantic 3D city data and models	Komninos et al. [87], Psyllidis et al. [129], Yao et al. [170]
Semantic deci- sion support	Semantic spatial decision support system, urban information frameworks, planning informatics	Plume [127]
Semantic enrich- ment	Semantic alignment, en- richment, integration and verification of data	Iwaniak et al. [76], Tardy et al. [149]
Semantic feed- back and commu- nication	Feedback and communica- tion for knowledge man- agement for planning sup- port systems	Murgante and Garramone [119], Ruikar et al. [133]
Semantic knowl- edge generation	Knowledge generation and retrieval, knowl- edge graphs, knowledge formalisation and repre- sentation	Bereta et al. [17], Karalis et al. [80]

Table 4: Literature for the Synthetical MP.

Continuation of Table 4		
Domain	Contribution to SCPS	References
Semantic spatial	Representation of urban	Berta et al. [18], Billen [21]
modeling	space using semantic ur-	
	ban modelling	
Semantic support	Semantic support for	Baracho et al. [9], Guo et al. [64],
applications	Smart City and IoT	Katsumi and Fox [82], Komninos
	applications	et al. [87], Métral et al. [117], Zhao
		and Wang [172]
Semantic urban	Knowledge management	Berdier and Roussey [16], Biljecki
models	and ontology development	et al. [19], Caneparo et al. [29],
	for semantic urban models	Guyot et al. [65], Teller et al. [151]
Semantic urban	Semantic urban planning,	Ahlqvist et al. [4], Gomes et al.
planning	land use and land cover	[61], Kaczmarek et al. [78], Mon-
	management, planning on-	tenegro and Duarte [114], Ronzhin
	tologies, allocation-related	et al. [131], Soon [143]
	master-planning actions	
	Development of Domain	
Domain ontology	Semantic data integration	Cao and Hall [31], Corry et al.
development	for urban analytics, cou-	[40], Huang and Harrie [75], Psyl-
techniques	pling ontologies and urban	lidis [128]
	design guidelines, capture	
	spatio-temporal phenom- ena	
Domain ontol-	Ontology-based GIS and	Chaidron et al. [33], Fischer et al.
ogy development	big data analysis	[53], Gao et al. [57]
based on dynamic	ong data anarysis	
data		
	Searches and Informat	ion Queries
Data city indica-	Uniting ontology-based	Ding et al. [45], Santos et al. [136]
tors and frame-	geodata and geovisual	
works	analytics	
Knowledge	Knowledge access and dis-	Lacasta et al. [92], Langenhan [94],
access and	covery systems, spatial	Mai et al. [105]
discovery	knowledge retrieval	
Semantic query-	Spatio-semantic query,	Daum et al. [43], Scheider et al.
ing and answer-	answering geo-analytical	[137]
ing	questions	
Processes, Systems, and Agents		
Agent composi-	Agent composition frame-	Zhou et al. [173]
tion frameworks	works for automated	
	knowledge retrieval	
Dynamic Knowl-	DKG for cross-domain	Eibeck et al. [47]
edge Graph	scenarios development,	
(DKG)	PW built on ontologies	
	and linked data	

Continuation of Table 4		
Domain	Contribution to SCPS	References
Knowledge man-	Knowledge management	Gao et al. [57], Montenegro and
agement and	and planning support	Duarte [114], Murgante and Scorza
planning support	tools for urban typologies,	[120], Teller et al. [151]
in ontologies	genres, patterns, and urban	
	design heuristics	
Smart City rep-	Smart City representation	Aloufi and Alawfi [7], Komninos
resentation in on-	based in ontologies	et al. [87], Psyllidis [128], Psyllidis
tologies		et al. [129]
System architec-	Ontological design of sys-	Falquet et al. [51], Kaza and Hop-
ture design of on-	tem architecture	kins [84]
tologies		
End of Table 4		

5 Conclusions

In this paper we offer a rationale for planners to take note of SWT and their promising applications to help address some of the fundamental challenges of the practice of CP. We point towards the empirical traditions of CP and the growing interest in data and evidence to support planning decisions. We argue that CP is predisposed to be adopt some form of SWT – as it becomes ever more aware of the growing interdependencies of cities – resulting from the greater scale, accelerated pace, and complexity of cities – that is currently met with disciplinary fragmentation. We present four meta-practices, Representational MP, Evaluative MP, Projective MP, Synthetical MP, expanding the disciplinary triad of representation, evaluation, and projection with the data-synthetic meta-practice emerging to address of the rise of ICT, big data, and AI in relation to planning. We identify emergent traits in the Synthetical MP literature, for it is the largest and most recent body of research. In contrast, the three others build up on disciplinary traits of design and planning. The tetrahedral model of meta-practices introduced in this paper (see Fig. 1) will allow to develop future SPCS.

The literature review points to gaps that will need to be bridged in order for such systems to work. We identify a research gap related to approaches for blending spatial and non-spatial information – and enhancing future CIM with non-visual data. We foresee future research on representation of meaning and knowledge when thinking – for instance – of consensus as a precondition for decision making. We can also imagine the necessity to represent and visualise 'live models' or PW. Similarly, the Evaluative MP needs to be applied to monitoring urban change in order to transform urban data into meaningful long-term indicators (*e.g.* the idea of 'heartbeats of the city'). As scales and complexities increase, ontological frameworks will become necessary to link up the evaluation systems to support multi-criteria decision tasks across all scales of CP. The Projective MP still lacks fundamental ontologies for design, planning, and envisioning tasks. The example of DSE is not meant to be an automated 'design mechanism' but a support strategy. Alternatives to DSE exist and can be explored and translated into ontologies. Similarly to

the other MP, the challenge is to link up currently segmented semantic creation methods and to develop more robust generative design systems across all scales of CP. Designers and planners also require intuitive and flexible tools while DKG should enable smooth interaction between users and the system in order to learn and improve itself using AI. Linking across domains could be achieved by combining various methods of semantic knowledge generation, processing, and management. The Synthetical MP suggest that the foundations for a DKG, built on SWT, linked open data and AI, are available.

The presented literature on SCPS – at the intersection of CP and SWT – is thus not meant to be a 'mechanical' recipe for planning, but a guide to bring closer two groups of readers (researchers and practitioners) to the field of SCPS: geographers, city planners and urban studies scholars on one side – and data scientists, software developers and programmers on the other. We believe that the sketched synthesis between CP and SWT is going to be a new frontier for planning in the near future. Our vision is to further enhance digital CP and CIM – aiming to develop SCPS with the ability to dynamically infer knowledge in an effort to create the next generation of digital urban twins.

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List of abbreviations

- AI Artificial Intelligence
- AEC Architecture, Engineering, and Construction
- BIM Building Information Modeling
- CIM City Information Modeling
- CP City Planning
- DKG Dynamic Knowledge Graph
- DSE Design Space Exploration
- GIS Geographic Information System
- IoT Internet of Things
- KG Knowledge Graph
- LoD Level of Detail
- MP Meta-Practice
- OWL Web Ontology Language
- PW Parallel Worlds
- RDF Resource Description Framework
- SCPS Semantic City Planning Systems
- SWOT Strength, Weakness, Opportunities, and Threats
- SWT Semantic Web Technologies

References

- A Companion to the Philosophy of Language. In B. Hale and C. Wright, editors, A Companion to the Philosophy of Language, pages 309–330. Blackwell Publishing Ltd, Oxford, UK, 1999. doi:10.1111/b.9780631213260.1999.00015.x.
- [2] Semantic Web, 2015. URL https://www.w3.org/standards/semanticweb /.
- [3] CityGML, June 2020. URL http://www.citygml.org.
- [4] O. Ahlqvist, D. Varanka, S. Fritz, K. Janowicz, D. Varanka, S. Fritz, and K. Janowicz. Land Use and Land Cover Semantics : Principles, Best Practices, and Prospects. CRC Press, Oct. 2018. URL https://doi.org/10.1201/9781 351228596.
- [5] C. Alexander. *Notes on the Synthesis of Form.* Harvard University Press, Cambridge, Massachusetts and London, England, 1964.
- [6] C. Alexander, S. Ishikawa, and M. Silverstein. A Pattern Language: Towns, Buildings, Construction. Oxford University Press, 1977.
- [7] K. Aloufi and H. Alawfi. Smart Proximity: Annotating the Proximity of Entities In A Smart City Ontology. Dec. 2019.
- [8] I. Armeni, O. Sener, A. R. Zamir, H. Jiang, I. Brilakis, M. Fischer, and S. Savarese. 3D Semantic Parsing of Large-Scale Indoor Spaces. In 2016 IEEE Conference on Computer Vision and Pattern Recognition (CVPR), pages 1534–1543, Las Vegas, NV, USA, June 2016. IEEE. doi:10/ggn889.
- [9] R. M. A. Baracho, D. Soergel, M. L. Pereira Junior, and M. A. Henriques. A Proposal for Developing a Comprehensive Ontology for Smart Cities / Smart Buildings / Smart Life. In *The 10th International Multi-Conference on Complexity, Informatics and Cybernetics*, Mar. 2019.
- [10] M. Batty. Modelling Cities as Dynamic Systems. *Nature*, 231(5303):425–428, June 1971. doi:10/fgdwvd.
- [11] M. Batty. Defining geodesign (= GIS + design ?). Environment and Planning B: Planning and Design, 40(1):1–2, 2013. doi:10.1068/b4001ed.
- [12] M. Batty. *The New Science of Cities*. The MIT Press, Cambridge, Massachusetts London, England, 2017.
- [13] M. Batty. Defining Complexity in Cities. In D. Pumain, editor, *Theories and Models of Urbanization*, pages 13–26. Springer International Publishing, Cham, 2020. doi:10.1007/978-3-030-36656-8_2.

- [14] M. Batty and S. Marshall. The Origins of Complexity Theory in Cities and Planning. In J. Portugali, H. Meyer, E. Stolk, and E. Tan, editors, *Complexity Theories* of Cities Have Come of Age: An Overview with Implications to Urban Planning and Design, pages 21–45. Springer, Berlin, Heidelberg, 2012. doi:10.1007/978-3-642-24544-2_3.
- [15] J. Beirão, J. Duarte, R. Stouffs, and H. Bekkering. Designing with Urban Induction Patterns: A Methodological Approach. *Environment and Planning B: Planning and Design*, 39(4):665–682, Aug. 2012. doi:10/gc3j7q.
- [16] C. Berdier and C. Roussey. Urban Ontologies: The Towntology Prototype towards Case Studies. In Ontologies for Urban Development, volume 61 of Studies in Computational Intelligence, pages 1–14. Springer Berlin Heidelberg, Berlin, Heidelberg, 2007. doi:10.1007/978-3-540-71976-2.
- [17] K. Bereta, G. Xiao, and M. Koubarakis. Ontop-spatial: Ontop of geospatial databases. *Journal of Web Semantics*, 58, Oct. 2019. doi:10/ggtdjc.
- [18] M. Berta, L. Caneparo, A. Montuori, and D. Rolfo. Semantic urban modelling: Knowledge representation of urban space. *Environment and Planning B: Planning and Design*, 43(4):610–639, July 2016. doi:10/f8vvxj.
- [19] F. Biljecki, J. Stoter, H. Ledoux, S. Zlatanova, and A. Çöltekin. Applications of 3D City Models: State of the Art Review. *ISPRS International Journal of Geo-Information*, 4(4):2842–2889, Dec. 2015. doi:10/ggj6tw.
- [20] F. Biljecki, J. Lim, J. Crawford, D. Moraru, H. Tauscher, A. Konde, K. Adouane, S. Lawrence, P. Janssen, and R. Stouffs. Extending CityGML for IFC-sourced 3D city models. *Automation in Construction*, 121, Jan. 2021. doi:10/ghj5tc.
- [21] R. Billen. Semantic enrichment of 3D city models for sustainable urban development, 2011.
- [22] R. Billen, C. Zaki, M. Servières, G. Moreau, and P. Hallot. Developing an ontology of space: Application to 3D city modeling. In T. Leduc, G. Moreau, and R. Billen, editors, Usage, Usability, and Utility of 3D City Models – European COST Action TU0801, Nantes, France, 2012. EDP Sciences. doi:10/ggm87h.
- [23] C. Bizer, T. Heath, and T. Berners-Lee. Linked Data The Story So Far. International Journal on Semantic Web and Information Systems (IJSWIS), 5(3):1–22, 2009. doi:10/fc8zjt.
- [24] C. Boje, A. Guerriero, S. Kubicki, and Y. Rezgui. Towards a semantic Construction Digital Twin: Directions for future research. *Automation in Construction*, 114, June 2020. doi:10/ggvkpm.
- [25] M. Bonduel, A. Wagner, P. Pauwels, M. Vergauwen, and R. Klein. Including widespread geometry formats in semantic graphs using RDF literals. In *Proceedings of the 2019 European Conference for Computing in Construction*, pages 341– 350. European Council on Computing in Construction, 2019. doi:10/ghcrn9.

- [26] M. Burger, F. van Oort, and E. Meijers. Examining Spatial Structure Using Gravity Models. In L. D'Acci, editor, *The Mathematics of Urban Morphology*, Modeling and Simulation in Science, Engineering and Technology, pages 471–479. Springer International Publishing, Cham, 2019. doi:10.1007/978-3-030-12381-9_21.
- [27] S. Cairns and D. Tunas, editors. *Future Cities Laboratory: Indicia 01*. Lars Muller Publishers, Singapore ETH Centre, July 2017.
- [28] S. Calabretto, F. Pinet, M. A. Kang, and O. Corcho. Ontology Alignment in the Urban Domain. In *Ontologies in Urban Development Projects*, Advanced Information and Knowledge Processing, pages 55–68. Springer, London; New York, 2011.
- [29] L. Caneparo, M. Collo, D. di Giannantonio, V. Lombardo, A. Montuori, and S. Pensa. Generating Urban Morphologies from Ontologies. *Ontologies for urban development*, 2007.
- [30] L. Caneparo, M. Berta, and D. Rolfo. Semantic Analysis and 3D Generation of Buildings and Cities. *International Journal of Design Sciences & Technology*, 24 (1):1–37, July 2020. URL http://ijdst.europia.org/index.php/ijdst/ article/view/25.
- [31] J. Cao and D. Hall. Ontology-based Product Configuration for Modular Buildings. In 37th International Symposium on Automation and Robotics in Construction, Japan (Online), Oct. 2020. doi:10/ghgr85.
- [32] Centre for Digital Built Britain and University of Cambridge. National Digital Twin Programme, June 2020. URL https://www.cdbb.cam.ac.uk/whatwe-do/national-digital-twin-programme.
- [33] C. Chaidron, R. Billen, and J. Teller. Investigating a Bottom-up Approach for Extracting Ontologies from Urban Databases. In Ontologies for Urban Development, volume 61 of Studies in Computational Intelligence, pages 1–14. Springer Berlin Heidelberg, Berlin, Heidelberg, 2007. doi:10.1007/978-3-540-71976-2.
- [34] S. Chaillou. AI & Architecture An Experimental Perspective, Feb. 2019. URL ht tps://medium.com/built-horizons/ai-architecture-4clec34a42b8.
- [35] K. Chaturvedi and T. H. Kolbe. Integrating Dynamic Data and Sensors with Semantic 3D City Models in the Context of Smart Cities. *ISPRS Annals of Photogrammetry, Remote Sensing and Spatial Information Sciences*, IV-2/W1:31–38, Oct. 2016. doi:10/gcc6vg.
- [36] K. Chaturvedi, C. S. Smyth, G. Gesquière, T. Kutzner, and T. H. Kolbe. Managing Versions and History Within Semantic 3D City Models for the Next Generation of CityGML. In A. Abdul-Rahman, editor, *Advances in 3D Geoinformation*, pages 191–206. Springer International Publishing, Cham, 2017. doi:10.1007/978-3-319-25691-7_11.

- [37] K. Chaturvedi, Z. Yao, and T. H. Kolbe. Integrated Management and Visualization of Static and Dynamic Properties of Semantic 3D City Models. *ISPRS - International Archives of the Photogrammetry, Remote Sensing and Spatial Information Sciences*, XLII-4/W17:7–14, Sept. 2019. doi:10/gg27ds.
- [38] W. Chen, Z. Huang, F. Wu, M. Zhu, H. Guan, and R. Maciejewski. VAUD: A Visual Analysis Approach for Exploring Spatio-Temporal Urban Data. *IEEE Transactions on Visualization and Computer Graphics*, 24(9):2636–2648, Sept. 2018. doi:10/gd3mgk.
- [39] CIVAL. Singapore Views, 2020. URL https://fcl.ethz.ch/research/col laboration/cival/SingaporeViews.html.
- [40] E. Corry, P. Pauwels, S. Hu, M. Keane, and J. O'Donnell. A performance assessment ontology for the environmental and energy management of buildings. *Automation in Construction*, 57:249–259, Sept. 2015. doi:10/f7qzm2.
- [41] R. D. Coyne, M. A. Rosenman, A. D. Radford, M. Balachandran, and J. Gero. *Knowledge Based Design Systems*. Addison Wesley, 1990. URL http://cumi ncad.scix.net/cgi-bin/works/Show?e5e2.
- [42] N. Cross. From a Design Science to a Design Discipline: Understanding Designerly Ways of Knowing and Thinking. In R. Michel, editor, *Design Research Now: Essays and Selected Projects*, Board of International Research in Design, pages 41–54. Birkhäuser, Basel, 2007. doi:10.1007/978-3-7643-8472-2_3.
- [43] S. Daum, A. Borrmann, and T. H. Kolbe. A Spatio-Semantic Query Language for the Integrated Analysis of City Models and Building Information Models. In A. Abdul-Rahman, editor, *Advances in 3D Geoinformation*, Lecture Notes in Geoinformation and Cartography, pages 79–93. Springer International Publishing, Cham, 2017. doi:10.1007/978-3-319-25691-7_5.
- [44] R. de Klerk and J. Beirao. Ontologies and Shape Grammars A Relational Overview Towards Semantic Design Systems. In A. Herneoja, T. Österlund, and P. Markkanen, editors, *Complexity & Simplicity*, volume 2, pages 305–314, University of Oulu, Aug. 2016. CUMINCAD. URL http://papers.cumincad.or g/cgi-bin/works/Show?ecaade2016_217.
- [45] L. Ding, G. Xiao, D. Calvanese, and L. Meng. A Framework Uniting Ontology-Based Geodata Integration and Geovisual Analytics. *ISPRS International Journal* of Geo-Information, 9(8):474, July 2020. doi:10/gg8nzr.
- [46] S. Donkers, H. Ledoux, J. Zhao, and J. Stoter. Automatic conversion of IFC datasets to geometrically and semantically correct CityGML LOD3 buildings: Automatic conversion of IFC datasets to CityGML LOD3 buildings. *Transactions in GIS*, 20(4):547–569, Aug. 2016. doi:10/f874jr.
- [47] A. Eibeck, M. Q. Lim, and M. Kraft. J-Park Simulator: An ontology-based platform for cross-domain scenarios in process industry. *Computers & Chemical Engineering*, 131, Dec. 2019. doi:10/ghbmvt.

- [48] A. Eibeck, A. Chadzynski, M. Q. Lim, K. Aditya, L. Ong, A. Devanand, G. Karmakar, S. Mosbach, R. Lau, I. A. Karimi, E. Y. S. Foo, and M. Kraft. A Parallel World Framework for scenario analysis in knowledge graphs. *Data-Centric Engineering*, 1, 2020. doi:10/ghgpvz.
- [49] P. Engel. Controling Design Variations Designing a Semantic Controler for a Generative System. In J. Sousa, J. Xavier, and G. Henriques Castro, editors, Architecture in the Age of the 4th Industrial Revolution, volume 2, pages 369–376, University of Porto, Sept. 2019. CumInCAD. URL http://papers.cumincad. org/cgi-bin/works/Show?_id=ecaadesigradi2019_191.
- [50] P. Espinoza-Arias, M. Poveda-Villalón, R. García-Castro, and O. Corcho. Ontological Representation of Smart City Data: From Devices to Cities. *Applied Sciences*, 9(1):32, Jan. 2019. doi:10/gf9csd.
- [51] G. Falquet, C. Métral, J. Teller, and C. Tweed. Ontologies in Urban Development Projects. Advanced Information and Knowledge Processing. Springer, London; New York, 2011.
- [52] F. Farazi, M. Salamanca, S. Mosbach, J. Akroyd, A. Eibeck, L. K. Aditya, A. Chadzynski, K. Pan, X. Zhou, S. Zhang, M. Q. Lim, and M. Kraft. Knowledge Graph Approach to Combustion Chemistry and Interoperability. *ACS Omega*, 5(29):18342–18348, July 2020. doi:10/ghtg74.
- [53] G. Fischer, R. McCall, and A. Morch. JANUS: Integrating Hypertext with a Knowledge-Based Design Environment. Technical report, United States Army Research Institute for the Behavioral and Social Sciences, July 1990.
- [54] F. Fonseca, M. Egenhofer, C. Davis, and G. Câmara. Semantic Granularity in Ontology-Driven Geographic Information Systems. *Annals of Mathematics and Artificial Intelligence*, 36(1):121–151, Sept. 2002. doi:10/c4kdzg.
- [55] J. W. Forrester. Urban Dynamics. M.I.T. Press, Cambridge, Mass., 1969.
- [56] E. Fuchkina, S. Schneider, S. Bertel, and I. Osintseva. Design Space Exploration Framework. page 10, 2018.
- [57] X. Gao, W. Yu, Y. Rong, and S. Zhang. Ontology-Based Social Media Analysis for Urban Planning. In 2017 IEEE 41st Annual Computer Software and Applications Conference (COMPSAC), volume 1, pages 888–896, July 2017. doi:10/ghcf8b.
- [58] S. Geertman and J. Stillwell. Planning support systems: An inventory of current practice. *Computers, Environment and Urban Systems*, 28(4):291–310, July 2004. doi:10/fkgvtd.
- [59] J. Gil. City Information Modelling: A Conceptual Framework for Research and Practice in Digital Urban Planning. *Built Environment*, 46(4):501–527, Dec. 2020. doi:10/ghqp88.

- [60] P. H. Gleye. City Planning versus Urban Planning: Resolving a Profession's Bifurcated Heritage. *Journal of Planning Literature*, 30(1):3–17, Feb. 2015. doi:10/gjh7qq.
- [61] J. Gomes, P. Urbano, N. C. Montenegro, and J. Duarte. A computer-aided urban planning tool driven by semantic web ontologies. page 6, Aug. 2012.
- [62] G. Gröger and L. Plümer. CityGML Interoperable semantic 3D city models. *ISPRS Journal of Photogrammetry and Remote Sensing*, 71:12–33, July 2012. doi:10/f35zcd.
- [63] F. Grobler, A. Aksamija, H. Kim, R. Krishnamurti, K. Yue, and C. Hickerson. Ontologies and Shape Grammars: Communication between Knowledge-Based and Generative Systems. In J. S. Gero and A. K. Goel, editors, *Design Computing and Cognition '08*, pages 23–40, Dordrecht, 2008. Springer Netherlands. doi:10/b898vb.
- [64] K. Guo, Y. Lu, H. Gao, and R. Cao. Artificial Intelligence-Based Semantic Internet of Things in a User-Centric Smart City. *Sensors*, 18(5):1341, May 2018. doi:10/gd57z3.
- [65] J. Guyot, G. Falquet, and J. Teller. Incremental development of a shared urban ontology: The Urbamet experience. 2010.
- [66] U. Habitat. New Urban Agenda: H III: Habitat III: Quito 17-20 October 2016. United Nations, Nairobi, 2017.
- [67] S. A. Hasler. De Smart à Responsive, Les Enjeux de La Planification Urbaine à l'ère Du Numérique: Les Expériences de Genève et Singapour. Doctoral Thesis, EPFL, Lausanne, Switzerland, 2019. URL 10.5075/epfl-thesis-9038.
- [68] C. Hein, editor. The Routledge Handbook of Planning History. Routledge, 1 Edition. | New York : Routledge, 2017., first edition, Dec. 2017. doi:10.4324/9781315718996.
- [69] C. Hein. The What, Why, and How of Planning History. In C. Hein, editor, *The Routledge Handbook of Planning History*, pages 1–10. Routledge, 1 Edition. | New York : Routledge, 2017., first edition, Dec. 2017. doi:10.4324/9781315718996-1.
- [70] D. Helbing and E. Pournaras. Society: Build digital democracy. *Nature*, 527(7576): 33–34, Nov. 2015. doi:10/gg5k7s.
- [71] N. Henchley. Making Sense of Future Studies. *Alternatives*, 7(2):24–28, 1978.
- [72] P. Herthogs. Enhancing the Adaptable Capacity of Urban Fragments: A Methodology to Integrate Design for Change in Sustainable Urban Projects. PhD thesis, Vrije Universiteit Brussel, Brussels, Nov. 2016. URL 10.13140/RG.2.2.1770 5.62567.

- [73] C. Hoare, S. Pinheiro, S. Hu, and J. O'Donnell. A Contextual Ontology for Distributed Urban Data Management. *Proceedings of the Institution of Civil Engineers* - *Smart Infrastructure and Construction*, pages 1–9, Dec. 2020. doi:10/ghqfz7.
- [74] A.-H. Hor, G. Sohn, P. Claudio, M. Jadidi, and A. Afnan. A Semantic Graph Database for BIM-GIS Integrated Information Model For an Intelligent Urban Mobility Web Application. *ISPRS Annals of Photogrammetry, Remote Sensing and Spatial Information Sciences*, IV-4:89–96, Sept. 2018. doi:10/ghmprr.
- [75] W. Huang and L. Harrie. Towards knowledge-based geovisualisation using Semantic Web technologies: A knowledge representation approach coupling ontologies and rules. *International Journal of Digital Earth*, 0(0):1–22, Apr. 2019. doi:10/ggxkcr.
- [76] A. Iwaniak, I. Kaczmarek, J. Łukowicz, M. Strzelecki, S. Coetzee, and W. Paluszyński. Semantic Metadata for Heterogeneous Spatial Planning Documents. In *ISPRS Annals of Photogrammetry, Remote Sensing and Spatial Information Sciences*, volume IV-4-W1, pages 27–36. Copernicus GmbH, Sept. 2016. doi:10/gcc632.
- [77] A. Julin, K. Jaalama, J.-P. Virtanen, M. Pouke, J. Ylipulli, M. Vaaja, J. Hyyppä, and H. Hyyppä. Characterizing 3D City Modeling Projects: Towards a Harmonized Interoperable System. *ISPRS International Journal of Geo-Information*, 7(2):55, Feb. 2018. doi:10/gc78v7.
- [78] I. Kaczmarek, A. Iwaniak, and J. Łukowicz. New Spatial Planning Data Access Methods Through The Implementation Of The Inspire Directive. *Real Estate Man*agement and Valuation, 22(1):9–21, Mar. 2014. doi:10/ghcf7t.
- [79] B. Kamsu-Foguem, F. H. Abanda, M. B. Doumbouya, and J. F. Tchouanguem. Graph-based ontology reasoning for formal verification of BREEAM rules. *Cognitive Systems Research*, 55:14–33, June 2019. doi:10/ghcrn7.
- [80] N. Karalis, G. Mandilaras, and M. Koubarakis. Extending the YAGO2 Knowledge Graph with Precise Geospatial Knowledge. In C. Ghidini, O. Hartig, M. Maleshkova, V. Svátek, I. Cruz, A. Hogan, J. Song, M. Lefrançois, and F. Gandon, editors, *The Semantic Web – ISWC 2019*, volume 11779, pages 181–197. Springer International Publishing, Cham, 2019. doi:10.1007/978-3-030-30796-7_12.
- [81] S. Kardinal Jusuf, B. Mousseau, G. Godfroid, and V. Soh Jin Hui. Integrated modeling of CityGML and IFC for city/neighborhood development for urban microclimates analysis. *Energy Procedia*, 122:145–150, Sept. 2017. doi:10/gddfbq.
- [82] M. Katsumi and M. Fox. An Ontology-Based Standard for Transportation Planning. In JOWO, 2019.
- [83] J. Kaňuk, M. Gallay, and J. Hofierka. Generating time series of virtual 3-D city models using a retrospective approach. *Landscape and Urban Planning*, 139:40– 53, July 2015. doi:10/f7fks7.

- [84] N. Kaza and L. D. Hopkins. Ontology for Land Development Decisions and Plans. In J. Kacprzyk, J. Teller, J. R. Lee, and C. Roussey, editors, *Ontologies for Urban Development*, volume 61, pages 47–59. Springer Berlin Heidelberg, Berlin, Heidelberg, 2007. doi:10.1007/978-3-540-71976-2_5.
- [85] R. König, M. Bielik, M. Dennemark, T. Fink, S. Schneider, and N. Siegmund. Levels of Automation in Urban Design Through Artificial Intelligence: A Framework to Characterize Automation Approaches. *Built Environment*, 46(4):599–619, Dec. 2020. doi:10/ghqp9d.
- [86] R. König, Y. Miao, A. Aichinger, K. Knecht, and K. Konieva. Integrating urban analysis, generative design, and evolutionary optimization for solving urban design problems. *Environment and Planning B: Urban Analytics and City Science*, 47(6): 997–1013, July 2020. doi:10/ggtbmg.
- [87] N. Komninos, C. Bratsas, C. Kakderi, and P. Tsarchopoulos. Smart city ontologies: Improving the effectiveness of smart city applications. 2016. doi:10/gc6xjd.
- [88] A. Konde, H. Tauscher, F. Biljecki, and J. Crawford. Floor Plans In CityGML. IS-PRS Annals of Photogrammetry, Remote Sensing and Spatial Information Sciences, IV-4/W6:25–32, Sept. 2018. doi:10/ggvppg.
- [89] A. Konys. An Ontology-Based Knowledge Modelling for a Sustainability Assessment Domain. *Sustainability*, 10(2):300, Feb. 2018. doi:10/gc4k5d.
- [90] K. Kumar, A. Labetski, K. A. Ohori, H. Ledoux, and J. Stoter. Harmonising the OGC Standards for the Built Environment: A CityGML Extension for Land-Infra. *ISPRS International Journal of Geo-Information*, 8(6):246, June 2019. doi:10/ghtg7m.
- [91] T. Kutzner, K. Chaturvedi, and T. H. Kolbe. CityGML 3.0: New Functions Open Up New Applications. *PFG – Journal of Photogrammetry, Remote Sensing and Geoinformation Science*, 88(1):43–61, Feb. 2020. doi:10/ggs8b2.
- [92] J. Lacasta, J. Nogueras-Iso, R. Béjar, P. Muro-Medrano, and F. Zarazaga-Soria. A Web Ontology Service to facilitate interoperability within a Spatial Data Infrastructure: Applicability to discovery. *Data & Knowledge Engineering*, 63(3):947–971, Dec. 2007. doi:10/ccnftm.
- [93] S. Lai and C. Zoppi. An Ontology of the Strategic Environmental Assessment of City Masterplans. *Future Internet*, 3(4):362–378, Dec. 2011. doi:10/fxmhxk.
- [94] C. H. Langenhan. Investigating research strategies for accessing knowledge stored in semantic models. In *Respecting Fragile Places*, pages 403–411, University of Ljubljana, Sept. 2011. CUMINCAD. URL http://papers.cumincad.org/cg i-bin/works/paper/ecaade2011_014.
- [95] L. Laurian and A. Inch. On Time and Planning: Opening Futures by Cultivating a "Sense of Now". *Journal of Planning Literature*, 34(3):267–285, Aug. 2019. doi:10/gjh7tv.

- [96] P.-C. Lee, T.-P. Lo, M.-Y. Tian, and D. Long. An Efficient Design Support System based on Automatic Rule Checking and Case-based Reasoning. *KSCE Journal of Civil Engineering*, 23(5):1952–1962, May 2019. doi:10/ghcrn4.
- [97] A. Lehnerer. Grand Urban Rules. nai010 publishers, Rotterdam, 2009.
- [98] L. Li, F. Luo, H. Zhu, S. Ying, and Z. Zhao. A two-level topological model for 3D features in CityGML. *Computers, Environment and Urban Systems*, 59:11–24, Sept. 2016. doi:10/ggvr3g.
- [99] J. Lim, H. Tauscher, and F. Biljecki. Graph Transformation Rules For Ifc-To-Citygml Attribute Conversion. *ISPRS Annals of Photogrammetry, Remote Sensing* and Spatial Information Sciences, IV-4/W8:83–90, Sept. 2019. doi:10/ggvr8r.
- [100] C.-J. Lin. Design Criteria Modeling. In *Emerging Experience in Past, Present and Future of Digital Architecture*, pages 479–488, Daegu, May 2015. CUMINCAD.
- [101] C.-J. M.-L. C. Lin. Open Ontology: A Self-Organizing Tool for Knowledge Acquisition in a Case Library. In 13th International Conference on Computer Aided Architectural Design Research in Asia, pages 328–334, Chiang Mai, Apr. 2008. CUMINCAD.
- [102] G. Lombardini. Formal ontologies and strategic environmental assessment. A case study: The municipal land use plan of Genoa. *City, Territory and Architecture*, 3 (1):8, June 2016. doi:10/ghcf8g.
- [103] U. Lösch, J. Dugdale, and Y. Demazeau. Requirements for Supporting Individual Human Creativity in the Design Domain. In S. Natkin and J. Dupire, editors, *Entertainment Computing – ICEC 2009*, volume 5709, pages 210–215. Springer Berlin Heidelberg, Berlin, Heidelberg, 2009. doi:10.1007/978-3-642-04052-8_22.
- [104] L. Madrazo, A. Sicilia, and G. Gamboa. SEMANCO: Semantic Tools for Carbon Reduction in Urban Planning. In 9th European Conference on Product and Process Modelling,, Reykjavik, July 2012.
- [105] G. Mai, K. Janowicz, L. Cai, R. Zhu, B. Regalia, B. Yan, M. Shi, and N. Lao. SE-KGE: A location-aware Knowledge Graph Embedding model for Geographic Question Answering and Spatial Semantic Lifting. *Transactions in GIS*, n/a(n/a), May 2020. doi:10/ggzgbs.
- [106] S. Marshall. Planning, Design and the Complexity of Cities. In J. Portugali, H. Meyer, E. Stolk, and E. Tan, editors, *Complexity Theories of Cities Have Come* of Age: An Overview with Implications to Urban Planning and Design, pages 191– 205. Springer, Berlin, Heidelberg, 2012. doi:10.1007/978-3-642-24544-2_11.
- [107] S. Marshall. Science, pseudo-science and urban design. URBAN DESIGN International, 17(4):257–271, Nov. 2012. doi:10/gc3kck.

- [108] S. Marshall, Y. Gong, and N. Green. Urban Compactness: New Geometric Interpretations and Indicators. In L. D'Acci, editor, *The Mathematics of Urban Morphology*, Modeling and Simulation in Science, Engineering and Technology, pages 431–456. Springer International Publishing, Cham, 2019. doi:10.1007/978-3-030-12381-9_19.
- [109] E. Massaro, A. Athanassiadis, A. Psyllidis, and C. R. Binder. Ontology-Based Integration of Urban Sustainability Indicators. In C. R. Binder, E. Massaro, and R. Wyss, editors, *Sustainability Assessment of Urban Systems*, pages 332–350. Cambridge University Press, Cambridge, 2020.
- [110] K. McGlinn, D. O'Sullivan, C. Debruyne, E. Clinton, and R. Brennan. Geoff: A Linked Data Vocabulary for Describing the Form and Function of Spatial Objects. page 12.
- [111] M. Med and P. Křemen. Context-based ontology for urban data integration. In Proceedings of the 19th International Conference on Information Integration and Web-Based Applications & Services, iiWAS '17, pages 457–461, New York, NY, USA, Dec. 2017. Association for Computing Machinery. doi:10/ghcf7x.
- [112] L. Miltiades and D. C. Angelides. Spatial Planning and Semantics: An Innovative Spatial Decision Support System for Land-Use Planning. In 11th International Conference of the Hellenic Geographical Association (ICHGS–2018), "Innovative Geographies: Understanding and Connecting Our World",, Lavrion, Greece, Apr. 2018.
- [113] P. Müller. Procedural Modeling of Buildings. PhD thesis, ETH Zurich, 2010.
- [114] N. C. Montenegro and J. P. Duarte. Computational Ontology of Urban Design -Towards a City Information Model. In *eCAADe* 27, page 8, Istanbul, 2009.
- [115] N. C. Montenegro, J. Gomes, P. Urbano, and J. P. Duarte. 4CitySemantics: GISsemantic tool for urban intervention areas. 2011. URL https://core.ac.uk/r eader/41792450.
- [116] N. C. Montenegro, J. C. Gomes, P. Urbano, and J. P. Duarte. A Land Use Planning Ontology: LBCS. *Future Internet*, 4(1):65–82, Jan. 2012. doi:10/fxxkpj.
- [117] C. Métral, G. Falquet, and A. F. Cutting-Decelle. Towards Semantically Enriched 3D City Models: An Ontology-Based Approach. page 6, 2009.
- [118] C. Métral, A.-F. Cutting-Decelle, C. Métral, G. Falquet, M. Vonlanthen, G. Falquet, and M. Vonlanthen. Ontologies for Interconnecting Urban Models. In Advanced Information and Knowledge Processing, pages 61–72. Springer, London; New York, 2011.
- [119] B. Murgante and V. Garramone. Web 3.0 and Knowledge Management: Opportunities for Spatial Planning and Decision Making. In B. Murgante, S. Misra, M. Carlini, C. M. Torre, H.-Q. Nguyen, D. Taniar, B. O. Apduhan, and O. Gervasi, editors, *Computational Science and Its Applications – ICCSA 2013*, Lecture

Notes in Computer Science, pages 606–621, Berlin, Heidelberg, 2013. Springer. doi:10/ghcf6p.

- [120] B. Murgante and F. Scorza. Ontology and Spatial Planning. In B. Murgante, O. Gervasi, A. Iglesias, D. Taniar, and B. O. Apduhan, editors, *Computational Science and Its Applications ICCSA 2011*, Lecture Notes in Computer Science, pages 255–264, Berlin, Heidelberg, 2011. Springer. doi:10/d9fsqv.
- [121] V. Oliveira and P. Pinho. Evaluation in Urban Planning: Advances and Prospects. *Journal of Planning Literature*, 24(4):343–361, May 2010. doi:10/fpjjhc.
- [122] M. Pan, J. Sikorski, C. A. Kastner, J. Akroyd, S. Mosbach, R. Lau, and M. Kraft. Applying Industry 4.0 to the Jurong Island Eco-industrial Park. *Energy Procedia*, 75:1536–1541, Aug. 2015. doi:10/ghgpvv.
- [123] M. Pan, J. Sikorski, J. Akroyd, S. Mosbach, R. Lau, and M. Kraft. Design technologies for eco-industrial parks: From unit operations to processes, plants and industrial networks. *Applied Energy*, 175:305–323, Aug. 2016. doi:10/f8t8vx.
- [124] P. Pauwels, S. Zhang, and Y.-C. Lee. Semantic web technologies in AEC industry: A literature overview. *Automation in Construction*, 73:145–165, Jan. 2017. doi:10/f9hmxh.
- [125] A. D. Pimentel. Exploring Exploration: A Tutorial Introduction to Embedded Systems Design Space Exploration. *IEEE Design & Test*, 34(1):77–90, Feb. 2017. doi:10/gg8nk8.
- [126] N. Pittaras, G. Papadakis, G. Stamoulis, G. Argyriou, E. K. Taniskidou, E. Thanos, G. Giannakopoulos, L. Tsekouras, and M. Koubarakis. GeoSensor: Semantifying change and event detection over big data. In *Proceedings of the 34th ACM/SIGAPP Symposium on Applied Computing*, pages 2259–2266, Limassol Cyprus, Apr. 2019. ACM. doi:10/ggtdjd.
- [127] J. M. J. Plume. An Urban Information Framework to support Planning, Decision-Making & Urban Design. In Computer Aided Architectural Design Futures 2011, pages 653–668, Liege, July 2011. CUMINCAD. URL http://papers.cumin cad.org/cgi-bin/works/paper/cf2011_p152.
- [128] A. Psyllidis. Ontology-Based Data Integration from Heterogeneous Urban Systems: A Knowledge Representation Framework for Smart Cities. page 21, 2015.
- [129] A. Psyllidis, A. Bozzon, S. Bocconi, and C. Titos Bolivar. A Platform for Urban Analytics and Semantic Data Integration in City Planning. In G. Celani, D. M. Sperling, and J. M. S. Franco, editors, *Computer-Aided Architectural Design Futures. The Next City - New Technologies and the Future of the Built Environment*, volume 527, pages 21–36. Springer Berlin Heidelberg, Berlin, Heidelberg, 2015. doi:10.1007/978-3-662-47386-3_2.
- [130] H. W. J. Rittel and M. M. Webber. Dilemmas in a General Theory of Planning. *Policy Sciences*, 4(2):155–169, 1973. doi:10/c8mscz.

- [131] Ronzhin, Folmer, Maria, Brattinga, Beek, Lemmens, and van't Veer. Kadaster Knowledge Graph: Beyond the Fifth Star of Open Data. *Information*, 10(10):310, Oct. 2019. doi:10/ggcr5v.
- [132] A. Rowland, E. Folmer, and W. Beek. Towards Self-Service GIS—Combining the Best of the Semantic Web and Web GIS. *ISPRS International Journal of Geo-Information*, 9(12):753, Dec. 2020. doi:10/ghtgxv.
- [133] D. Ruikar, C. Anumba, A. Duke, P. Carrillo, and N. Bouchlaghem. Using the semantic web for project information management. *Facilities*, 25(13/14):507–524, Jan. 2007. doi:10/dzvm99.
- [134] S. Ruston McAleer, P. Kogut, and L. Raes. DUET: Digital Urban European Twins. White Paper, Pilzen, Feb. 2020. URL https://www.digitalurbantwins.com.
- [135] O. Sabag Muñoz and E. Gladek. One Planet Approaches Methodology Mapping and Pathways Forward. White Paper, Metabolic, Rotterdam, Apr. 2017.
- [136] H. Santos, V. Dantas, V. Furtado, P. Pinheiro, and D. L. McGuinness. From Data to City Indicators: A Knowledge Graph for Supporting Automatic Generation of Dashboards. arXiv:1704.01946 [cs], Apr. 2017. URL http://arxiv.org/ab s/1704.01946.
- [137] S. Scheider, R. Meerlo, V. Kasalica, and A.-L. Lamprecht. Ontology of core concept data types for answering geo-analytical questions. *Journal of Spatial Information Science*, (20):167–201, June 2020. doi:10/gg3h9r.
- [138] G. Schrotter and C. Hürzeler. The Digital Twin of the City of Zurich for Urban Planning. PFG – Journal of Photogrammetry, Remote Sensing and Geoinformation Science, 88(1):99–112, Feb. 2020. doi:10/ggvkr3.
- [139] B. Schwab, C. Beil, and T. Kolbe. Spatio-Semantic Road Space Modeling for Vehicle–Pedestrian Simulation to Test Automated Driving Systems. *Sustainability*, 12(9):3799, May 2020. doi:10/gg24cb.
- [140] K. C.-Y. Seto, W. Solecki, and C. Griffith. The road ahead for urbanization and sustainability research. In *The Routledge Handbook of Urbanization and Global Environmental Change*. Routledge, New York, 2016. URL http://www.routle dgehandbooks.com/doi/10.4324/9781315849256.
- [141] P. Shukla, J. Skea, E. C. Buendia, and V. Masson-Delmotte, H.- O. Pörtner, D. C. Roberts, P. Zhai, R. Slade, S. Connors, R. van Diemen, M. Ferrat, E. Haughey, S. Luz, S. Neogi, M. Pathak, J. Petzold, J. Portugal Pereira, P. Vyas, E. Huntley, K. Kissick, M. Belkacemi, J. Malley. IPCC, 2019: Summary for Policymakers. In Climate Change and Land: An IPCC Special Report on Climate Change, Desertification, Land Degradation, Sustainable Land Management, Food Security, and Greenhouse Gas Fluxes in Terrestrial Ecosystems. IPCC, 2019.
- [142] Sidewalklabs. Delve: Discover Radically Better Design, Oct. 2020. URL https: //hello.delve.sidewalklabs.com.

- [143] K. H. Soon. A Conceptual Framework of Representing Semantics for 3D Cadastre in Singapore. 2012.
- [144] A. Stadler, C. Nagel, G. König, and T. H. Kolbe. Making Interoperability Persistent: A 3D Geo Database Based on CityGML. In J. Lee and S. Zlatanova, editors, 3D Geo-Information Sciences, pages 175–192. Springer Berlin Heidelberg, Berlin, Heidelberg, 2009. doi:10.1007/978-3-540-87395-2_11.
- [145] D. Stead. Conceptualizing the Policy Tools of Spatial Planning. *Journal of Planning Literature*, page 088541222199228, Mar. 2021. doi:10/gh83zg.
- [146] G. Stiny and J. Gips. Shape Grammars and the Generative Specification of Painting and Sculpture. 1971.
- [147] T. Stojanovski. City Information Modelling (CIM) and Urban Design Morphological Structure, Design Elements and Programming Classes in CIM. In *eCAADe* 2018, Lodz, Poland, Sept. 2018.
- [148] M. Swilling, M. Hajer, T. Baynes, J. Bergesen, F. Labbé, J. Kaviti Musango, A. Ramswami, B. Robinson, S. Salat, S. Suh, P. Currie, A. Fang, A. Hanson, K. Kruit, M. Reiner, S. Suzanne, and S. Tabouri. The Weight of Cities: Resource Requirements of Future Urbanization. Technical report, International Resource Panel (IRP) of the United Nations Environment Programme (UNEP), Nairobi, Kenya, 2018. URL https://www.resourcepanel.org/reports/weightcities.
- [149] C. Tardy, L. Moccozet, and G. Falquet. Semantic alignment of documents with 3D city models. In T. Leduc, G. Moreau, and R. Billen, editors, *Usage, Usability, and Utility of 3D City Models European COST Action TU0801*, page 02011, Nantes, France, 2012. EDP Sciences. doi:10/ggvr8m.
- [150] H. Tauscher, J. Lim, and R. Stouffs. A modular graph transformation rule set for IFC-to-CityGML conversion. *Transactions in GIS*, page tgis.12723, Jan. 2021. doi:10/ghvhpr.
- [151] J. Teller, J. R. Lee, C. Roussey, and J. Kacprzyk, editors. Ontologies for Urban Development, volume 61 of Studies in Computational Intelligence. Springer Berlin Heidelberg, Berlin, Heidelberg, 2007. doi:10.1007/978-3-540-71976-2.
- [152] N. Tempelmeier, Y. Rietz, I. Lishchuk, T. Kruegel, O. Mumm, V. Miriam Carlow, S. Dietze, and E. Demidova. Data4UrbanMobility: Towards Holistic Data Analytics for Mobility Applications in Urban Regions. In *Companion Proceedings of The* 2019 World Wide Web Conference on - WWW '19, pages 137–145, San Francisco, USA, 2019. ACM Press. doi:10/gg5k7h.
- [153] R. F. Tomlinson. A Geographic Information System for Regional Planning. Journal of Geography (Chigaku Zasshi), 78(1):45–48, 1969. doi:10/dcb493.
- [154] A. M. Townsend. *Smart Cities: Big Data, Civic Hackers, and the Quest for a New Utopia.* W.W. Norton & Company, New York, first edition edition, 2013.

- [155] A. F. Trento. Ontologies for Cities of the Future: The quest of formalizing interaction rules of urban phenomena. In *Future Cities*, pages 797–804, ETH Zürich, Sept. 2010. CumInCAD. URL http://papers.cumincad.org/cgibin/works/_id=ecaade2013/Show?ecaade2010_224.
- [156] E. P. Trindade, M. P. F. Hinnig, E. M. da Costa, J. S. Marques, R. C. Bastos, and T. Yigitcanlar. Sustainable Development of Smart Cities: A Systematic Review of the Literature. *Journal of Open Innovation: Technology, Market, and Complexity*, 3(1), Dec. 2017. doi:10/ggfr6n.
- [157] UN. Growth rates of urban agglomerations by size class 2014 to 2030, 2018. URL https://population.un.org/wup/default.aspx?aspxerrorpath=/wu p/maps/CityGrowth/CityGrowth.aspx.
- [158] K. H. van Dam and J. Keirstead. Re-use of an ontology for modelling urban energy systems. In *Next Generation Infrastructure Systems for Eco-Cities*, pages 1–6, Shenzhen, China, Nov. 2010. IEEE. doi:10/d2vwj3.
- [159] S. Verweij and E.-M. Trell. Qualitative Comparative Analysis (QCA) in Spatial Planning Research and Related Disciplines: A Systematic Literature Review of Applications:. *Journal of Planning Literature*, Apr. 2019. doi:10/gf4r9g.
- [160] A. von Richthofen, editor. Urban Elements: Advanced Studies in Urban Design. ETH Zurich, 2018. doi:10.3929/ETHZ-B-000270354.
- [161] A. von Richthofen, K. Knecht, Y. Miao, and R. König. The 'Urban Elements' method for teaching parametric urban design to professionals. *Frontiers of Architectural Research*, 7(4):573–587, 2018. doi:10/gfwv6p.
- [162] J. Voros. A generic foresight process framework. *Foresight*, 5(3):10–21, June 2003. doi:10/d2bj4h.
- [163] P. Waddell, A. Borning, M. Noth, G. Ulfarsson, N. Freier, and M. Becke. Microsimulation of Urban Development and Location Choices: Design and Implementation of UrbanSim. *Networks and Spatial Economics*, 3:43–67, Jan. 2003. doi:10/fwxms7.
- [164] A. Wagner, M. Bonduel, P. Pauwels, and U. Rüppel. Representing constructionrelated geometry in a semantic web context: A review of approaches. *Automation in Construction*, 115:103130, July 2020. doi:10/ghcrpg.
- [165] H. Wang, Y. Pan, and X. Luo. Integration of BIM and GIS in sustainable built environment: A review and bibliometric analysis. *Automation in Construction*, 103:41–52, July 2019. doi:10/ghcrnz.
- [166] Y. Wang, H. Fan, and G. Zhou. Reconstructing facade semantic models using hierarchical topological graphs. *Transactions in GIS*, 24(4):1073–1097, 2020. doi:10.1111/tgis.12616.

- [167] N. Wiegand. Preserving Detail in a Combined Land Use Ontology. In N. Xiao, M.-P. Kwan, M. F. Goodchild, and S. Shekhar, editors, *Geographic Information Science*, Lecture Notes in Computer Science, pages 284–297, Berlin, Heidelberg, 2012. Springer. doi:10/ghcf8p.
- [168] S. Yao, X. Ling, F. Nueesch, G. Schrotter, S. Schubiger, Z. Fang, L. Ma, and Z. Tian. Maintaining Semantic Information across Generic 3D Model Editing Operations. *Remote Sensing*, 12(2):335, Jan. 2020. doi:10/ghcgjv.
- [169] Z. Yao and T. H. Kolbe. Dynamically Extending Spatial Databases to support CityGML Application Domain Extensions using Graph Transformations. volume 26, pages 316–331, Würzburg, 2017. DGPFG.
- [170] Z. Yao, C. Nagel, F. Kunde, G. Hudra, P. Willkomm, A. Donaubauer, T. Adolphi, and T. H. Kolbe. 3DCityDB - a 3D geodatabase solution for the management, analysis, and visualization of semantic 3D city models based on CityGML. *Open Geospatial Data, Software and Standards*, 3(1):5, Dec. 2018. doi:10/ggvppj.
- [171] N. Zhang, S. Deng, H. Chen, X. Chen, J. Chen, X. Li, and Y. Zhang. Structured Knowledge Base as Prior Knowledge to Improve Urban Data Analysis. *ISPRS International Journal of Geo-Information*, 7(7):264, July 2018. doi:10/gfck4s.
- [172] J. Zhao and Y. Wang. Toward domain knowledge model for smart city: The core conceptual model. In 2015 IEEE First International Smart Cities Conference (ISC2), pages 1–5, Guadalajara, Mexico, Oct. 2015. IEEE. doi:10/ggtdg3.
- [173] X. Zhou, A. Eibeck, M. Q. Lim, N. B. Krdzavac, and M. Kraft. An agent composition framework for the J-Park Simulator - A knowledge graph for the process industry. *Computers & Chemical Engineering*, 130, Nov. 2019. doi:10/ggtdg4.