

Knowledge (Fagin *et al.*, 1995) provides a thorough introduction, and Gordon and Hobbs (2017) provide *A Formal Theory of Commonsense Psychology*.

The second approach is a first-order theory in which mental objects are fluents. Davis (2005) and Davis and Morgenstern (2005) describe this approach. It relies on the possible-worlds formalism, and builds on work by Robert Moore (1980, 1985).

The third approach is a **syntactic theory**, in which mental objects are represented by character strings. A string is just a complex term denoting a list of symbols, so *CanFly(Clark)* can be represented by the list of symbols [*C, a, n, F, l, y, (, C, l, a, r, k,)*]. The syntactic theory of mental objects was first studied in depth by Kaplan and Montague (1960), who showed that it led to paradoxes if not handled carefully. Ernie Davis (1990) provides an excellent comparison of the syntactic and modal theories of knowledge. Pnueli (1977) describes a temporal logic used to reason about programs, work that won him the Turing Award and which was expanded upon by Vardi (1996). Littman *et al.* (2017) show that a temporal logic can be a good language for specifying goals to a reinforcement learning robot in a way that is easy for a human to specify, and generalizes well to different environments.

The Greek philosopher Porphyry (c. 234–305 CE), commenting on Aristotle’s *Categories*, drew what might qualify as the first semantic network. Charles S. Peirce (1909) developed existential graphs as the first semantic network formalism using modern logic. Ross Quillian (1961), driven by an interest in human memory and language processing, initiated work on semantic networks within AI. An influential paper by Marvin Minsky (1975) presented a version of semantic networks called **frames**; a frame was a representation of an object or category, with attributes and relations to other objects or categories.

The question of semantics arose quite acutely with respect to Quillian’s semantic networks (and those of others who followed his approach), with their ubiquitous and very vague “IS-A links.” Bill Woods’s (1975) famous article “What’s In a Link?” drew the attention of AI researchers to the need for precise semantics in knowledge representation formalisms. Ron Brachman (1979) elaborated on this point and proposed solutions. Patrick Hayes’s (1979) “The Logic of Frames” cut even deeper, claiming that “Most of ‘frames’ is just a new syntax for parts of first-order logic.” Drew McDermott’s (1978b) “Tarskian Semantics, or, No Notation without Denotation!” argued that the model-theoretic approach to semantics used in first-order logic should be applied to all knowledge representation formalisms. This remains a controversial idea; notably, McDermott himself has reversed his position in “A Critique of Pure Reason” (McDermott, 1987). Selman and Levesque (1993) discuss the complexity of inheritance with exceptions, showing that in most formulations it is NP-complete.

Description logics were developed as a useful subset of first-order logic for which inference is computationally tractable. Hector Levesque and Ron Brachman (1987) showed that certain uses of disjunction and negation were primarily responsible for the intractability of logical inference. This led to a better understanding of the interaction between complexity and expressiveness in reasoning systems. Calvanese *et al.* (1999) summarize the state of the art, and Baader *et al.* (2007) present a comprehensive handbook of description logic.

The three main formalisms for dealing with nonmonotonic inference—circumscription (McCarthy, 1980), default logic (Reiter, 1980), and modal nonmonotonic logic (McDermott and Doyle, 1980)—were all introduced in one special issue of the *AI Journal*. Delgrande and Schaub (2003) discuss the merits of the variants, given 25 years of hindsight. Answer set programming can be seen as an extension of negation as failure or as a refinement of