ONTOLOGY-BASED CLASSIFICATION OF MOLECULES: A LOGIC PROGRAMMING APPROACH

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#### Life sciences data deluge

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- Life sciences data deluge
- Hierarchical organisation of biochemical knowledge

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 Fast, automatic and repeatable classification driven by Semantic technologies

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- Fast, automatic and repeatable classification driven by Semantic technologies
- Web Ontology Language, a W3C standard family of logic-based formalisms
- OWL bio- and chemo-ontologies widely adopted

OWL ontology Chemical Entities of Biological Interest

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Dictionary of molecules with taxonomical information

# OWL ontology Chemical Entities of Biological Interest Dictionary of molecules with taxonomical information



~ caffeine is a cyclic molecule

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→ serotonin is an organic molecule

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#### → ascorbic acid is a carboxylic ester

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- Existing chemical databases describe millions of molecules
- Speed up growth by automating chemical classification

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Language for representing biochemical structures with a favourable performance/expressivity trade-off

# **CLASSIFYING STRUCTURED OBJECTS**



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$$\begin{split} \text{ascorbicAcid}(x) \rightarrow & \text{hasAtom}(x, f_1(x)) \land \ldots \land \text{hasAtom}(x, f_{13}(x)) \\ & \text{o}(f_1(x)) \land \ldots \land c(f_7(x)) \land \ldots \land \\ & \text{single}(f_1(x), f_7(x)) \land \text{double}(f_7(x), f_2(x)) \land \ldots \end{split}$$



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$$\begin{split} & \text{hasAtom}(x,y_1) \wedge \text{hasAtom}(x,y_2) \wedge y_1 \neq y_2 \rightarrow \text{polyatomicEntity}(x) \\ & \wedge_{i=1}^5 \text{hasAtom}(x,y_i) \wedge c(y_1) \wedge o(y_2) \wedge o(y_3) \wedge \\ & c(y_4) \wedge \text{horc}(y_5) \wedge \text{double}(y_1,y_2) \wedge \\ & \text{single}(y_1,y_3) \wedge \text{single}(y_3,y_4) \wedge \text{single}(y_1,y_5) \rightarrow \underset{\sim}{\text{carboxylicEster}(x)} \\ & \searrow \\ & \bigcirc \\$$



#### **Input fact:** ascorbicAcid(a)

 $\begin{array}{l} \textbf{Stable model: ascorbicAcid}(a), \ hasAtom(a, a_i^f) \ for \ 1 \leq i \leq 13, \\ \textbf{o}(a_i^f) \ for \ 1 \leq i \leq 6, \ c(a_i^f) \ for \ 7 \leq i \leq 12, \ h(a_{13}^f), \ single(a_8^f, a_3^f), \\ single(a_9^f, a_4^f), \ single(a_{12}^f, a_i^f) \ for \ i \in \{5, 11\}, \ single(a_{11}^f, a_6^f), \\ single(a_{10}^f, a_i^f) \ for \ i \in \{1, 9, 11, 13\}, \ single(a_7^f, a_i^f) \ for \ i \in \{1, 8\}, \\ double(a_2^f, a_7^f), \ double(a_8^f, a_9^f), \ horc(a_i^f) \ for \ 7 \leq i \leq 13, \\ \textbf{polyatomicEntity}(a), \ carboxylicEster(a), \ cyclic(a) \end{array}$ 



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→ Ascorbic acid is a cyclic polyatomic entity and a carboxylic ester

- 1 Existence of subcomponents
  - Carbon molecules



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- Carboxylic acids and carboxylic esters





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  - Alkanes



methane



C<sub>3</sub>H<sub>8</sub> propane



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  - Ascorbic acid is asserted to be a carboxylic acid (release 95)
  - Not listed among the subsumptions derived by our prototype





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  - SMILES-based surface syntax

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Language for representing biochemical structures with a favourable performance/expressivity trade-off

Future directions

SMILES-based surface syntax

 $\begin{array}{l} \wedge_{i=1}^{5}hasAtom(x,y_{i}) \wedge c(y_{1}) \wedge o(y_{2}) \wedge o(y_{3}) \wedge c(y_{4}) \wedge \\ double(y_{1},y_{2}) \wedge single(y_{1},y_{3}) \wedge single(y_{3},y_{4}) \wedge single(y_{1},y_{5}) \\ \rightarrow carboxylicEster(x) \end{array}$ 

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define carboxylicEster some hasAtom SMILES(COC(= O)[\*]) end.

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    - E.g., Carboxylic ester is an organic molecular entity

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  - E.g., Small molecules if they weigh less than 800 daltons

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- Thank you! Questions?!?