# MaSh: Machine Learning for Sledgehammer

**Daniel Kühlwein** ICIS, Radboud Universiteit Nijmegen, The Netherlands

Jasmin Christian Blanchette Fakultät für Informatik, Technische Universität München, Germany

#### Cezary Kaliszyk

Institut für Informatik, Universität Innsbruck, Austria

#### Josef Urban

ICIS, Radboud Universiteit Nijmegen, The Netherlands

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Sledgehammer (Paulson & Blanchette, 2010) is a subsystem of the proof assistant Isabelle/HOL (Nipkow et al., 2002) that discharges interactive goals by harnessing external automatic theorem provers (ATPs). It heuristically selects a number of relevant facts (axioms, definitions, or lemmas) from the thousands available in background libraries and the user's formalization, translates the problem to the external provers' logics, and reconstructs any machine-found proof in Isabelle. The tool is popular with both novices and experts.

Meng and Paulson (Meng & Paulson, 2009) designed a filter, MePo, that iteratively ranks and selects facts similar to the current goal, based on the symbols they contain. Despite its simplicity, and despite advances in prover technology (Hoder & Voronkov, 2011; Schulz, 2011), this filter greatly increases the success rate: Most provers cannot cope with tens of thousands of formulas, and translating so many formulas would also put a heavy burden on Sledgehammer.

MaSh is a learning-based alternative to MePo. It learns from successful proofs, whether human-written or machine-generated. MaSh's heart is a Python program that implements a custom version of a weighted sparse naive Bayes algorithm that is faster than the algorithms used in previous studies (Alama et al., 2011). The program maintains a persistent state and supports incremental, nonmonotonic updates. Although distributed with Isabelle, it is fully independent and could be used by other proof assistants or applications with similar requirements.

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DANIEL.KUEHLWEIN@GMAIL.COM BLANCHETTE@IN.TUM.DE

CEZARY.KALISZYK@UIBK.AC.AT

JOSEF.URBAN@GMAIL.COM