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## unarXive: a large scholarly data set with publications' full-text, annotated in-text citations, and links to metadata

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## Abstract

Abstract
In recent years, scholarly data sets have been used for various purposes, such as paper recommendation, citation recommendation, citation context analysis, and citation context-based document summarization. The evaluation of approaches to such tasks and their applicability in real-world scenarios heavily depend on the used data set. However, existing scholarly data sets are limited in several regards. In this paper, we propose a new data set based on all publications from all scientific disciplines available on arXiv.org, Apart from providing the papers' plain text, in-text citations were annotated via global identifiers. Furthermore, citing and cited publications were linked to the Microsoft Academic Graph, providing access to rich metadata. Our data set consists of over one million documents and 29.2 million citation contexts. The data set, which is made freely available for research purposes, not only can enhance the future evaluation of research paper-based and citation context-based approaches, but also serve as a basis for new ways to analyze in-text citations, as we show prototypically in this article.

Keywords Scholarly data · Citations · arXiv.org · Digital libraries · Data set

## Introduction

A variety of tasks use scientific paper collections to help researchers in their work. For instance, research paper recommender systems have been developed (Beel et al. 2016). Related are systems that operate on a more fine-grained level within the full text, such as the textual contexts in which citations appear (i.e., citation contexts). Based on citation contexts, things like the citation function (Teufel et al. 2006a, b: Moravcsik and Murugesan 1975), the citation polarity (Ghosh et al. 2016; Abu-Jbara et al. 2013), and the citation importance (Valenzuela et al. 2015; Chakraborty and Narayanam 2016) can be determined. Furthermore, citation contexts are necessary for context-aware citation recom-mendation (He et al. 2010; Ebesu and Fang 2017), as well as for citation-based document

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-<sec id="Sec1"> <title>Introduction</title> opplicability in real-world sc existing scholarly data sets All publications from all scientifum providing the papers' plain text dentifiers. Furthermore, citing and mak of cont Academic Graph, providing access to ARTP-7c4 one million documents and 29.2 million made freely available for research purpolication of research paper-based and citatifue as a basis for new ways to analyze intificially in this article.

Erxiv.org, digital libraries, data set) In this paper, we focus on the task of column of the col <xref ref-type="bibr" rid="CR10"</pre> <xref ref-type="bibr" rid="CR1</pre> paper collections to help researchers in their wo or recommender systems have been developed \citep[8ee ms that operate on a more fine-grained level within t ual contexts in which citations appear (i.e., citatio nus
DS, things like the citation function~\citep{Teufel2006E1
siki975}, the citation polarity-\citep(GhoshD017,Abu-Jba
ion importance~\citep{Valenzuela2015fixed,Chakraborty201 tion importance-\citep(Valenzuela2015fixed,Chakraborty2020, hermore, citation contexts are necessary for context-aware c \citep(Heo2016WM,Ebenzu2017), as well as for citation-based tasks \citep(Chandrasekaran2019), such as citation-based aut on \citep(Mohammad2009) and automated related work section ge an of approaches developed for all these tasks as well as the actual ap and usefulness of developed systems in real-world scenarios heavily dep used data set. Such a data set is typically a collection of papers provial text, or a set of already extracted citation contexts, consisting of, fince, 1-3 sentences each. Existing data sets, however, do not fulfill all ollowing criteria (see Sec.-tyref(sec:related-work) for more details): \textit(size.) The data set can be comparatively small (below 100,000 docume ich makes it difficult to use it for training and testing machine learning a es;• <mark>\textit(</mark>Cleanliness.) The papers' full texts or citation contexts are often



