# Beyond iTunes for Papers: Redefining the Unit of Interaction in Literature Review Tools

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## ABSTRACT

Conducting an effective literature review is an essential step in all scientific work. However, the process is difficult, particularly for interdisciplinary work. Here, we articulate a key avenue for improvement for literature review tools: supporting the appropriate unit of interaction, which we argue is a "grounded claim", a concise statement linked to key contextual details such as evidence. However, there are

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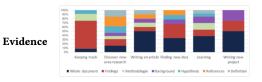
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#### Claim

Scientists primarily read specific fragments of articles.

#### Context



- Related Online journal logs show that scientists claims view only 1 3 pages on average; life scientists self-report mostly reading the findings sections of articles.
- **Provenance** Reported in mid-2000's by European computer-scientists in Int'l Journal of Digital Libraries.

Figure 1: An example of a claim that is grounded with different kinds of context: a key figure as *evidence*, corroboration by other *related claims*, and information about the *provenance* of the claim.

significant cognitive and interaction costs in creating them. We share insights from our development of a prototype literature review tool, the KNOWLEDGE COMPRESSOR, that aims to lower these costs.

## INTRODUCTION

To advance knowledge scientists must order what is currently known and unknown about research problems [10]. This synthesis typically manifests as the challenging task of *literature reviewing*. Conducting effective literature reviews is challenging: beginning researchers often struggle to distill and organize key claims from papers [5], and experienced researchers often avoid conducting, updating, and publishing literature reviews, due to the imbalance of returns on the amount of time and effort needed [10]. **How can we make literature reviewing less painful and more commonplace**?

#### **PROBLEM ANALYSIS**

#### Researchers need to work with grounded claims

Many commercial (e.g., Mendeley, Zotero) and research literature review tools [11, 21] explicitly or implicitly assume that the *paper* is the unit of interaction. Functioning like "iTunes for papers", researchers import papers, reason about relationships between papers (e.g., with tags, stars, citation links), annotate papers, and export papers as citations in written literature reviews. But is the paper the right unit of interaction for literature reviewing tools?

We argue that systems should enable researchers to work directly with **grounded claims**. Grounded claims are concise statements grounded in context that helps a user understand, interpret, judge, and use a claim (see Fig. 1). For example, a claim might be contextualized by its *evidence*, such as a key figure or experiment details, or *related claims* that corroborate, oppose, or clarify a focal claim. The *provenance* of a claim, such as its source collaboration networks, institutional dynamics, and prestige, can be important context for understanding its validity and impact [7]. Our idea for grounded claims is rooted in models of scientific argumentation that also specify a scientific statement, linked to evidence, as a basic unit of scientific discourse [8, 9, 16].

To see why researchers need to be able to work with grounded claims, not just papers, it is helpful to understand that sensemaking [14] is a core subtask of literature reviewing [21]. In the conceptual language of sensemaking theory [14], researchers search for a new representation (i.e., conceptual model, theory, or argument) that is based on existing ideas in the literature to guide their subsequent research. Importantly, the process of searching for these representations is highly iterative, involving multiple shifts in mental representations supported by reinterpretations of data [14]. For example, a researcher attempting to prototype a system supporting scientists' paper reading behavior might need to reconcile conflicting claims on how scientists read, with some claim that people frequently read through whole documents, and others claim that scientists primarily read specific fragments of articles. The researcher may need to dig into the contextual details of evidence to consider whether



Figure 2: Four example grounded claims on KNOWLEDGE COMPRESSOR's claim canvas. The focal claim (A) is explicitly connected to a claim from another study that closely replicates it (B), and implicitly connected to a similar (but not exactly alike) claim (C). Another claim about the amount of reading scientists must do (D) suggests a potential explanation for scientists' reading behaviors. Clicking on a "min/max" button on the context segments toggles whether they are expanded or collapsed (E). If the user needs more information, there is a direct link (F) back to the location surrounding the claim. these contradictory findings might be explained by research methods, user populations, or user goals (i.e., what the scientists are reading for, such as discovering a new research area or writing an article).

The preceding example illustrates a key point from CSCW research on knowledge reuse: knowledge items must be identified and evaluated, but also be recontextualized in order to be reused effectively [1]. The lack of support for navigating de/recontextualization with grounded claims in existing systems may not be a critical barrier to scientific progress within disciplinary boundaries, where researchers are able to hold more information in memory as they gain expertise. However, there may still be room for substantial efficiency gains that can reduce the overhead of doing research. Research on sensemaking demonstrates that even small changes in the cost structure of individual access actions can have compounding effects on efficiency [13], which can impact downstream sensemaking, such as the degree to which researchers explore different ways of understanding existing findings and what research should be done next. Further, providing direct support for reuse is likely to be important for interdisciplinary, collaborative, and distributed research, which are increasingly becoming predominant forms of research [18, 19].

## Efficiently creating grounded claims is challenging

As noted, literature review tools largely do not support working with grounded claims. Instead, researchers adapt other tools to approximate the ability to work with grounded claims, such as spreadsheets and text editors [20], and qualitative analysis software [3]. Some research systems have been proposed, such as "micropublications" [6] in bioinformatics, but uptake has been limited.

We assert that the central challenge to enabling grounded claims is the *cost structure* [14] of creating them. CSCW studies of knowledge reuse describe the **cognitive costs** of deciding in advance what details need to be retained as context for future reuse [2], with costly consequences for downstream task performance if a premature and inaccurate decision is made early on [15]. Also, systems that require high amounts of precision for specifying context during sensemaking may impose unnecessary **interaction costs** [4, 15].

## THE KNOWLEDGE COMPRESSOR SYSTEM

To address these challenges, we are prototyping the KNOWLEDGE COMPRESSOR<sup>1</sup>, a **claim-oriented** lit-reviewing system that enables users to create and work with grounded claims (not just papers) as a unit of interaction. In KNOWLEDGE COMPRESSOR, claims can be grounded by two kinds of context: 1) *evidence*: claims can be easily linked to one or more "segments" of a source PDF document (e.g., table, figure, methods details, quote) (see Fig. 3) and 2) *related claims*: claims can be connected (either with explicit links, or implicitly, by spatial proximity) to other claims on our claim canvas, which operates similarly to argument diagramming and modeling software (e.g., [17]; see Fig. 2).

<sup>&</sup>lt;sup>1</sup>An example usage of the KNOWLEDGE COM-PRESSOR is in https://vimeo.com/354474886.

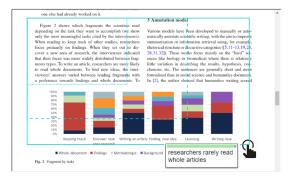


Figure 3: Users create claims by selecting a segment of the source document in the reading pane and writing a (re)description of the associated claim.

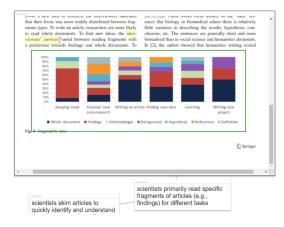


Figure 4: Users can adjust "flexibly compressed" context segments. For example, a user can scroll up in the segment to note that evidence for this claim comes from interviews (see the yellow highlight) and reason about reliability/diversity of evidence, or extract more details about which sections tend to be read for what kinds of tasks to inform design of a system that highlights specific sections for specific tasks. At the heart of KNOWLEDGE COMPRESSOR is the "flexible compression" mechanism for lowering the cognitive and interaction costs of creating grounded claims. We deliberately designed the flexible compression to work similarily to conventional annotation, to reduce the cost of learning a new interface: users selecting a segment of a PDF document and typing a note in a text box to associate to that segment (see Fig. 3). Unlike conventional annotation, however, these segments are *flexible*, and can be adjusted/expanded by the reuser, because they are "live slices" of the source PDF (powered by a pdfjs React component) (see Fig. 4). Reusers can also link directly back to the source document in the reading pane from the segment, if even more context is needed. The flexibility of the context segment eases both the *cognitive costs* of deciding precisely which parts of the document count as context, and the *interaction costs* of precisely specifying contextual details, since the context can be adjusted more naturally by the reuser during the recontextualization step of knowledge reuse.

## **Example Usage**

To illustrate the potential value of KNOWLEDGE COMPRESSOR, we return to our earlier example of the researcher attempting to reconcile conflicting findings about scientists' reading behavior. In a typical setup, such as a combination of notes in MS Word and papers in Zotero, the researcher would need to track back the paper citations, open up each source PDF, and read again to locate the context - one claim at a time. Alternatively, they might need to create a new spreadsheet in MS Excel and record these contextual details for each claim, or modify their notes accordingly.

In contrast, if the claims were captured as grounded claims in KNOWLEDGE COMPRESSOR, they could explore different hypotheses by toggling the adjustable/expandable context segments for the claims, in a spatial layout, all at once. With a few scrolls from the context segments, they could quickly notice differences in contextual details that may explain the contradiction, such as whether the claim comes from observational studies or self-reported surveys, or variations in research expertise (number of years in conducting research). These contextual details drive them to the design decision of optimizing scientific reading through personalisation, such as highlighting different sections for different users.

#### **CONCLUSION AND FUTURE WORK**

We plan to conduct systematic evaluations of how creating grounded claims could change the cost structure, including controlled experiments against conventional annotation, measuring the cognitive load, response time, and number of behavioral signals (e.g. clicks, re-writes, re-selections). We also plan to explore other techniques to easing the cost structure, including automatic identification of specific candidate contexts (e.g., participant details, measures, parameters) to attach to claims, and intelligent text input [12] to further speed up and ease the process of redescribing key claims.

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