# Grounding "grounding": How is grounding used within various AI conferences?

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### **Abstract**

Terminology used within linguistics and AI conferences tend to be overused, leading to ambiguous meaning and difficulty navigating new papers. This paper will elucidate the various senses of the word "grounding" through qualitative analysis and deeper quantitative analysis of its various uses. This work will showcase how "grounding" is an overloaded term and guide users to understand how to more easily decipher and understand papers using the term. All code can be found at https://git.uwaterloo. ca/e48huang/cs-784/-/tree/final\_ project/final\_project?ref\_type=heads where a University of Waterloo account is required.

### 1 Introduction

Many conferences centering around Artificial Intelligence have existed for many decades, evolving over time on the types of problems that they tackle. While these problems change over time, so do the terminology, which have a tendency to evolve semantically, leading to overloaded terms. One such term is "grounding", the idea that one wishes to ensure that there is understanding or a common ground (Nakano et al., 2003). While this term seems simple, it is used in many various contexts, all of which requires different datasets, methods and metrics to evaluate, while being applied in different settings.

To better understand the term "grounding" and its usage, we perform both quantitative analysis and qualitative analysis. This paper explores the "Seed42Lab/AI-paper-crawl" HuggingFace dataset (Forty-Two AI Lab) which collects full-text papers from 11 different conferences spanning from the first year of the conference to 2024. To first select different senses of the word "grounding", we perform preliminary quantitative analysis to filter for papers to further investigate. From these selected

Conference	Paper Count
AAAI	772
ACL	632
CVPR	862
ECCV	511
<b>EMNLP</b>	575
ICCV	341
ICLR	360
ICML	360
IJCAI	654
NAACL	226
NeurIPS	654

Table 1: Counts of unique papers with "grounding" by conference found in the corpora.

papers, we identify 9 related but distinct meanings of the word "grounding". We perform some literature review to understand how these different senses are understood, from its various datasets, methods, metrics and applications. Finally, for each of these word senses, we investigate how they have evolved over time.

### 2 Paper Selection

A simple search over the number of papers which have the term "grounding" quickly shows that it is infeasible to cover all possible instances. For example, the Association for Computational Linguistics (ACL) alone has 632 unique papers that have an instance of "grounding" (see Table 1). While not all these instances are due to the paper itself being related to grounding, as they can simply include it within its bibliography, they are indicative that some filtering is necessary.

To filter through these papers, we propose a method which selects the most relevant papers within a conference to the word "grounding". We take a naive approach where we select the top 10% of papers with the word "grounding". We deter-

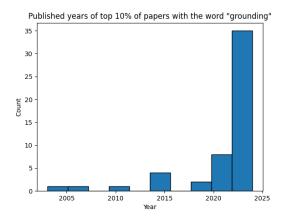


Figure 1: Count of selected conference papers per year

mine which papers are more important to "grounding" based on the word frequency, if "grounding" appears more often compared to other words within a paper, then it should be more relevant. This process (while ensuring uniqueness across conferences) resulted in 46 curated papers<sup>1</sup>, spanning from the years 2000 to 2024, shown in the following figure. While this selection of papers may not cover the breadth of senses of grounding might entail, as it misses on papers from the 1980's to 2000's, it does cover the most commonly used senses of the word.

# 3 Grounding "grounding"

In this section we cover the different senses of the word "grounding" found in the 46 papers covered in the previous section. We will explore the common methods, datasets, applications and metrics revolving around each word. We will continue to elucidate the meanings of the word and its trend within the next section.

# 3.1 Visual Grounding

Visual grounding, also known as image, phrase or referring expression grounding (Xiao et al., 2024; Li et al., 2024) refers to the challenge of trying to localize specific regions within an image based on some textual description. Traditionally, this involved finding the phrase's referring region by predicting a bounding box around said region. As time has gone on however, there has been more and more types of challenges that one could tackle within visual grounding (Xiao et al., 2024). From the 46

papers we filtered for, we have discovered the following subcategories involved in visual grounding:

- 1. Classical visual grounding
- Gigapixel level grounding. TODO: add citations

3.

Gigapixel level grounding

- 3.2 Spatio-temporal Grounding
- 3.3 3D Grounding
- 3.4 Video and Audio Grounding
- 3.5 Markov Logic Networks Grounding
- 3.6 Face-to-Face Grounding
- 3.7 Action Grounding
- 3.8 Relational Grounding
- 4 How has "grounding" evolved over time?

In this section, we will take each previous section's meaning of "grounding" and build an understanding of its trends through observing the co-occurrence over time with other key words for each specific sense.

### 4.1 Visual Grounding

TODO: Also explore why there are so many different ways to mean visual grounding. Also explore which datasets are most popular within these papers.

- 4.2 Spatio-temporal Grounding
- 4.3 3D Grounding
- 4.4 Video and Audio Grounding
- 4.5 Markov Logic Networks Grounding
- 4.6 Face-to-Face Grounding
- 4.7 Action Grounding
- 4.8 Relational Grounding
- 5 Engines

To produce a PDF file, pdflaTeX is strongly recommended (over original LaTeX plus dvips+ps2pdf or dvipdf). The style file acl.sty can also be used with lualaTeX and XelaTeX, which are especially suitable for text in non-Latin scripts. The file acl\_lualatex.tex in this repository provides an example of how to use acl.sty with either lualaTeX or XelaTeX.

¹https://git.uwaterloo.ca/e48huang/cs-784/-/
blob/e09a1c22c0de7e331ca16109a5f32b226dc6d9c5/
final\_project/grounding\_top\_p.txt

### 6 Preamble

The first line of the file must be

\documentclass[11pt]{article}

To load the style file in the review version:

\usepackage[review]{acl}

For the final version, omit the review option:

\usepackage{acl}

To use Times Roman, put the following in the preamble:

\usepackage{times}

(Alternatives like txfonts or newtx are also acceptable.)

Please see the LATEX source of this document for comments on other packages that may be useful.

Set the title and author using \title and \author. Within the author list, format multiple authors using \and \And and \AND; please see the LATEX source for examples.

By default, the box containing the title and author names is set to the minimum of 5 cm. If you need more space, include the following in the preamble:

\setlength\titlebox{<dim>}

where <dim> is replaced with a length. Do not set this length smaller than 5 cm.

# 7 Document Body

### 7.1 Footnotes

Footnotes are inserted with the \footnote command.<sup>2</sup>

### 7.2 Tables and figures

See Table 2 for an example of a table and its caption. **Do not override the default caption sizes.** 

As much as possible, fonts in figures should conform to the document fonts. See Figure 2 for an example of a figure and its caption.

Using the graphicx package graphics files can be included within figure environment at an appropriate point within the text. The graphicx package supports various optional arguments to control the appearance of the figure. You must include it explicitly in the LATEX preamble (after the \documentclass declaration and before \begin{document}) using \usepackage{graphicx}.

Command	Output	Command	Output
{\"a}	ä	{\c c}	ç
{\^e}	ê	{\u g}	ğ
{\`i}	ì	{\1}	ł
{\.I}	İ	{\~n}	ñ
{\o}	Ø	{\H o}	ő
{\'u}	ú	{\v r}	ř
{\aa}	å	{\ss}	В

Table 2: Example commands for accented characters, to be used in, *e.g.*, BibT<sub>F</sub>X entries.

# Golden ratio

(Original size: 32.361×200 bp)

Figure 2: A figure with a caption that runs for more than one line. Example image is usually available through the mwe package without even mentioning it in the preamble.

### 7.3 Hyperlinks

Users of older versions of LATEX may encounter the following error during compilation:

\pdfendlink ended up in different nesting level than \pdfstartlink.

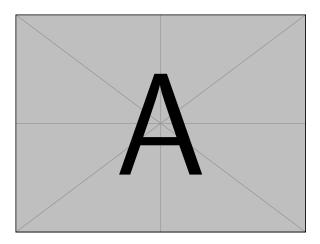
This happens when pdfLaTeX is used and a citation splits across a page boundary. The best way to fix this is to upgrade LaTeX to 2018-12-01 or later.

### 7.4 Citations

Table 3 shows the syntax supported by the style files. We encourage you to use the natbib styles. You can use the command \citet (cite in text) to get "author (year)" citations, like this citation to a paper by ?. You can use the command \citep (cite in parentheses) to get "(author, year)" citations (?). You can use the command \citealp (alternative cite without parentheses) to get "author, year" citations, which is useful for using citations within parentheses (e.g. ?).

A possessive citation can be made with the command \citeposs. This is not a standard natbib command, so it is generally not compatible with other style files.

<sup>&</sup>lt;sup>2</sup>This is a footnote.



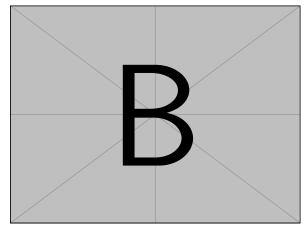


Figure 3: A minimal working example to demonstrate how to place two images side-by-side.

Output	natbib command	ACL only command
(?)	\citep	
?	\citealp	
?	\citet	
<b>(?</b> )	\citeyearpar	
?'s (?)		\citeposs

Table 3: Citation commands supported by the style file. The style is based on the natbib package and supports all natbib citation commands. It also supports commands defined in previous ACL style files for compatibility.

#### 7.5 References

The LATEX and BibTEX style files provided roughly follow the American Psychological Association format. If your own bib file is named custom.bib, then placing the following before any appendices in your LATEX file will generate the references section for you:

\bibliography{custom}

You can obtain the complete ACL Anthology as a BibTEX file from https://aclweb.org/anthology/anthology.bib.gz. To include both the Anthology and your own .bib file, use the following instead of the above.

\bibliography{anthology,custom}

Please see Section 8 for information on preparing BibTEX files.

# 7.6 Equations

An example equation is shown below:

$$A = \pi r^2 \tag{1}$$

Labels for equation numbers, sections, subsections, figures and tables are all defined with the \label{label} command and cross references to them are made with the \ref{label} command.

This an example cross-reference to Equation 1.

### 7.7 Appendices

Use \appendix before any appendix section to switch the section numbering over to letters. See Appendix A for an example.

## 8 BibT<sub>F</sub>X Files

Unicode cannot be used in BibTEX entries, and some ways of typing special characters can disrupt BibTEX's alphabetization. The recommended way of typing special characters is shown in Table 2.

Please ensure that BibTeX records contain DOIs or URLs when possible, and for all the ACL materials that you reference. Use the doi field for DOIs and the url field for URLs. If a BibTeX entry has a URL or DOI field, the paper title in the references section will appear as a hyperlink to the paper, using the hyperref LATeX package.

### Limitations

Since December 2023, a "Limitations" section has been required for all papers submitted to ACL Rolling Review (ARR). This section should be placed at the end of the paper, before the references. The "Limitations" section (along with, optionally, a section for ethical considerations) may be up to one page and will not count toward the final page

limit. Note that these files may be used by venues that do not rely on ARR so it is recommended to verify the requirement of a "Limitations" section and other criteria with the venue in question.

### Acknowledgments

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### References

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### A Example Appendix

This is an appendix.