

# Semantically Orthogonal Framework for Citation Classification: Disentangling Intent and Content

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## Background & Motivation

*"Citations have long been used to characterize the state of a scientific field and to identify influential works.*

*However, writers use citations for different purposes, and this varied purpose influences uptake by future scholars."*

— Jurgens et al., *Measuring the Evolution of a Scientific Field through Citation Frames, Transactions of the Association for Computational Linguistics*, 6, 391-406., 2018

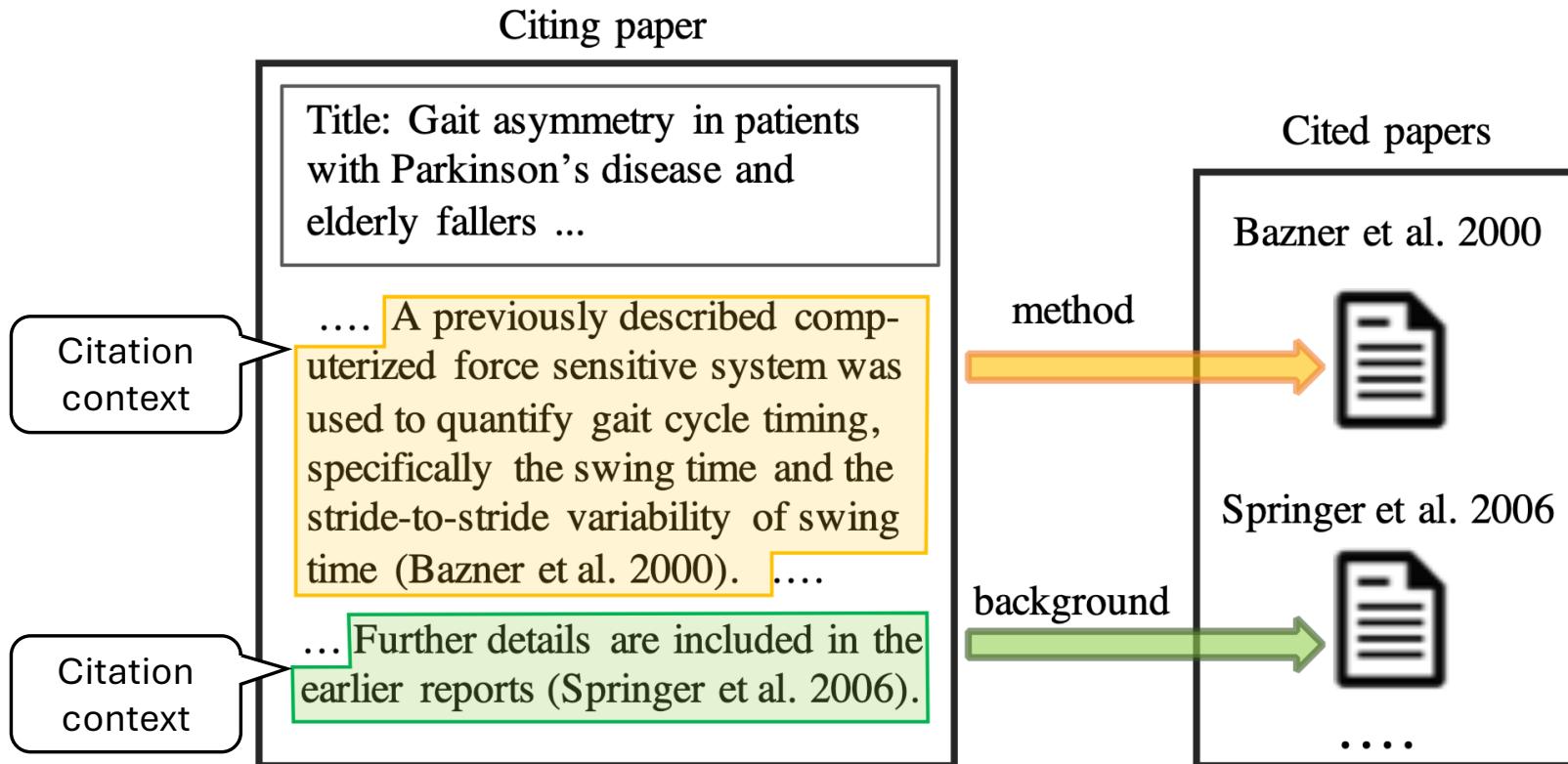
## Background & Motivation

*Citations are also typically used as the main measure for assessing impact of scientific publications, venues, and researcher (Li and Ho, 2008).*

*...identifying the intent of citations is critical in improving automated analysis of academic literature and scientific impact measurement (Leydesdorff, 1998; Small, 2018).*

— Cohan et al., *Structural Scaffolds for Citation Intent Classification in Scientific Publications*,  
*Proceedings of NAACL-HLT*, pages 3586–3596, 2019

# Background & Motivation



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# Background & Motivation

The screenshot shows a Semantic Scholar search results page for the paper "GLUE: A Multi-Task Benchmark and Analysis Platform for Natural Language Understanding".

**Header:** SEMANTIC SCHOLAR, Search 229,061,554 papers from all fields of science, Search, Sign In, Create Free Account.

**DOI:** 10.18653/v1/W18-5446 • Corpus ID: 5034059

**Title:** GLUE: A Multi-Task Benchmark and Analysis Platform for Natural Language Understanding

**Authors:** Alex Wang, Amanpreet Singh, +3 authors, Samuel R. Bowman

**Published in:** BlackboxNLP@EMNLP 20 April 2018 • Computer Science, Linguistics

**TLDR:** A benchmark of nine diverse NLU tasks, an auxiliary dataset for probing models for understanding of specific linguistic phenomena, and an online platform for evaluating and comparing models, which favors models that can represent linguistic knowledge in a way that facilitates sample-efficient learning and effective knowledge-transfer across tasks.

**Expand**

**Citation Metrics:**

- 7,460 Citations
- Highly Influential Citations: 1,310
- Background Citations: 2,472
- Methods Citations: 3,403
- Results Citations: 106

**Actions:** Share, View All

**Buttons:** [PDF] Semantic Reader, Save to Library, Create Alert, Cite

**Links:** Figures and Tables, Topics, 7,460 Citations, 77 References, Related Papers

A blue callout box on the right points to the citation metrics section with the text "3 Types of Citation".

# The Evolution of Citation Classification Framework

12 types within 4 group

(*Weakness, Contrast,  
Positive, Neutral*)

(Citation Function Corpus)

**CFC, 2006**

6 types

(*Use, Basis, Comparison,  
Criticizing, Substantiating,  
Neutral*)

**Abu-Jbara et al., 2013**

3 types

Streamlined from ACL-ARC

(*Background, Method,  
ResultComparison*)

**SciCite, 2019**

**CITO, 2010**

(Citation Typing Ontology)

>30 citation relations

an ontology-based  
framework

**ACL-ARC, 2018**

6 types

(*Background, Motivation,  
Comparison or Contrast,  
Uses, Extension, Future*)

**ACT, 2020 & ACT2, 2022**

6 types, similar to ACL-ARC

+ (*Influential | Incidental*)  
for author influence, and  
comparability

# The Evolution of Citation Classification Framework

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Uses, Extension, Future*)

**ACT (2020) & ACT2 (2022)**

6 types, similar to **ACL-ARC**

+ (*Influential | Incidental*)  
for author influence, and  
comparability

# Challenges

“uses method in”,  
“uses data from”,  
“uses conclusions from”  
—— CiTO

Forces the act of use to be tied directly to the object being used.

“background”,  
“motivation”, “future”  
*(noun-based states)*  
“use”, “extend”,  
“compare/contrast”  
*(verb-based actions)*  
—— ACL-ARC

Same grammar pattern doesn't fit both.  
Perspective shifts between citing vs. cited work.

“comparison/contrast”  
—— ACL-ARC

“criticizing”<sup>[2]</sup>  
“substantiating”<sup>[2]</sup>  
“neutral”<sup>[1,2]</sup>

Describe the surface act or stance but leave the author's purpose implicit.

[1] Automatic classification of citation function (Teufel et al., EMNLP 2006)  
[2] Purpose and Polarity of Citation: Towards NLP-based Bibliometrics (Abu-Jbara et al., NAACL 2013)

# Challenges

## Dimensional Entanglement

Conflates what is cited (method, data, finding) with why it is cited (use, extend).

This causes type explosion and leaves boundary cases unclassifiable, increasing annotator burden.

## Perspective Ambiguity

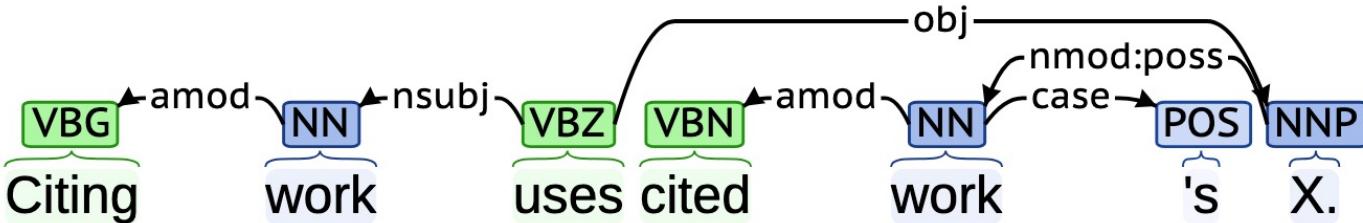
Mixes action types (verbs: use, extend, compare) with state types (nouns: background, motivation, future).

This inconsistent grammar shifts perspective between citing and cited work, confusing annotators.

## Lack of Functional Grounding

describe **what** happens, but not the underlying intent.

# Our Solutions



From the Perspective of **Dependency Grammar**:

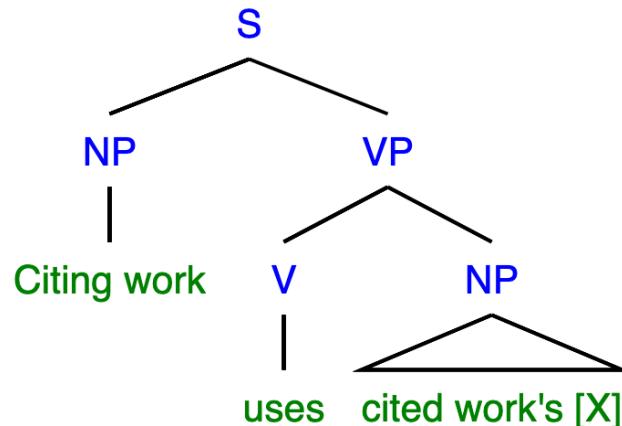
1. **Citing work** is always the **subject (nsubj)**.
2. **Citation intent** is the **root verb** of the relation.
3. **Cited work and its contribution** is always the **object (obj)**.

Disentangling  
Intent and  
Content

Ensuring  
Perspective  
consistent

(visualization with <https://corenlp.run/>)

# Our Solutions



From the Perspective of **Constituency Grammar**:

1. **Cited work** and **its contribution** form a **Noun Phrase (NP)**.
2. We should also classify the types of **contributions**.

(visualization with <https://dprebyl.github.io/syntree/>)

# Our Solutions – 1. Normalize Framework with Generative Grammar

$S \rightarrow$	$VP \rightarrow$	NP	Version 1 (ACL-ARC)
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase
Templates			Types
Citing work	frames	cited work's [X]	as background knowledge
	derives	motivation	from cited work's [X]
	uses	cited work's [X]	Uses
	extends	cited work's [X]	Extends
	compare/contrast		with cited work's [X]
	projects	future steps	from cited work's [X]
			Future

# Our Solutions – 1. Normalize Framework with Generative Grammar

$S \rightarrow$	$VP \rightarrow$	NP	Version 1 (ACL-ARC)
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase
Templates			Types
	frames	cited work's [X]	as background knowledge
	contextualize		with cited work's [X]
	derives	motivation	from cited work's [X]
	uses	cited work's [X]	Uses
Citing work	has	an extension	from cited work's [X]
	has	an comparison/contrast	with cited work's [X]
	projects	future steps	from cited work's [X]
	justify	[Y] (future action)	with cited work's [X]

# Our Solutions – 1. Normalize Framework with Generative Grammar

$S \rightarrow$	$VP \rightarrow$	NP	Version 1 (ACL-ARC)
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase
Templates			Types
Citing work	frames	cited work's [X]	as background knowledge
	contextualize		with cited work's [X]
	derives	motivation	from cited work's [X]
	justify	[Y] (gaps/needs)	with cited work's [X]
	uses	cited work's [X]	Uses
	has	an extensi	from cited work's [X]
	has	an comparison/contrast	with cited work's [X]
	projects	future steps	from cited work's [X]
		Definition of “Motivation” in ACL-ARC	
			Future

# Our Solutions – 1. Normalize Framework with Generative Grammar

<b>S →</b>	<b>VP →</b>	<b>NP</b>	<b>Version 1 (ACL-ARC)</b>
<b>Noun Phrase</b>	<b>Verb</b>	<b>Noun Phrase</b>	<b>Prep. + Noun Phrase</b>
<b>Templates</b>			<b>Types</b>
Citing work	frames	cited work's [X]	as background knowledge
	contextualize		with cited work's [X]
	derives	motivation	from cited work's [X]
	justify	[Y] (gaps/needs)	with cited work's [X]
	uses	cited work's [X]	Uses
	uses	cited work's [X]	Uses
	extends	cited work's [X]	Extends
	extends	cited work's [X]	Extends
	compare/contrast		with cited work's [X]
	compare/contrast		with cited work's [X]
projects			from cited work's [X]
			Future

# Our Solutions – 1. Normalize Framework with Generative Grammar

<b>S →</b>	<b>VP →</b>	<b>NP</b>	<b>Version 1 (ACL-ARC)</b>
<b>Noun Phrase</b>	<b>Verb</b>	<b>Noun Phrase</b>	<b>Prep. + Noun Phrase</b>
<b>Templates</b>			<b>Types</b>
Citing work	frames	cited work's [X]	as background knowledge
	contextualize		with cited work's [X]
	derives	motivation	from cited work's [X]
	justify	[Y] (gaps/needs)	with cited work's [X]
	uses	cited work's [X]	Uses
	uses	cited work's [X]	Uses
	extends	cited work's [X]	Extends
	extends	cited work's [X]	Extends
	compare/contrast		cited work's [X]
	compare/contrast		cited work's [X]
“Future” defined as “potential avenue” in ACL-ARC			
	projects	future steps	from cited work's [X]
	justify	[Y] (future action)	with cited work's [X]
			Justify [Y]

## Our Solutions – 2. Pragmatic Distinction

S →	VP →	NP	Version 2
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase
Templates			Types
Citing work	frames	cited work's [X]	as background knowledge
	contextualize		with cited work's [X]
	derives	motivation	from cited work's [X]
	justify	[Y] (gaps/needs)	with cited work's [X]
	uses	cited work's [X]	Uses
	uses	cited work's [X]	Uses
	extends	cited work's [X]	Extends
	extends	cited work's [X]	Extends
	compare/contrast		with cited work's [X]
	compare/contrast		with cited work's [X]
	projects	future steps	from cited work's [X]
	justify	[Y] (future action)	with cited work's [X]

## Our Solutions – 2. Pragmatic Distinction

S →	VP →	NP	Version 2
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase
Templates			Types
	contextualize		with cited work's [X] Contextualize
	justify	[Y] (gaps/future action)	with cited work's [X] Justify [Y]
Citing work	uses	cited work's [X]	Uses
	extends	cited work's [X]	Extends
	compare/contrast	with cited work's [X]	Compare/Contrast

## Our Solutions – 2. Pragmatic Distinction

S →	VP →	NP	Version 2	
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase	
Citing work	Templates			Types
	contextualize		with cited work's [X]	Contextualize
	justify	[Y] (gaps/future action)	with cited work's [X]	Justify
	signals	gap	from cited work's [X]	Signal Gap
	highlights	limitation	of cited work's [X]	Highlight Limitation
	justifies	design choice	with cited work's [X]	Justify Design Choice
	uses	cited work's		Uses
	extends	cited work's		Extends
	compare/contrast	cited work's	unresolved flaw or constrain of existing [X] design choice by referencing [X]	Compare/Contrast

## Our Solutions – 2. Pragmatic Distinction

S →	VP →	NP	Version 2
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase
Citing work	Templates		Types
	contextualize		with cited work's [X] Contextualize
	justify		with cited work's [X] Justify
	signals		from cited work's [X]
	highlights		of cited work's [X]
	justifies		with cited work's [X]
	uses		Uses
extends	cited work's [X]		Extends
modifies	cited work's [X]		Modify
compare/contrast		with cited work's [X]	Compare/Contrast

**“Modify” is broader than “Extend”: it can include adding, removing, adapting, changing, or integrating a cited work’s contribution.**

## Our Solutions – 2. Pragmatic Distinction

S →	VP →	NP	Version 2
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase
Templates		Types	
contextualize		with cited work's [X]	
justify		with cited work's [X]	
signals		from cited work's [X]	
highlights		of cited work's [X]	
justifies		with cited work's [X]	
uses		cited work's [X]	
extends		cited work's [X]	
modifies		cited work's [X]	
compare/contrast		with cited work's [X]	
evaluates against		cited work's [X]	

## Our Solutions – 2. Pragmatic Distinction

S →	VP →	NP	Version 3	
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase	
Citing work	Templates			Types
	contextualize		with cited work's [X]	Contextualize
	justify	[Y] (gaps/future action)	with cited work's [X]	Justify
	signals	gap	from cited work's [X]	Signal Gap
	highlights	limitation	of cited work's [X]	Highlight Limitation
	justifies	design choice	with cited work's [X]	Justify Design Choice
	uses	cited work's [X]		Uses
	extends	cited work's [X]		Extends
	modifies	cited work's [X]		Modify
	compare/contrast		with cited work's [X]	Compare
	evaluates against	cited work's [X]		Evaluates Against

## Our Solutions – 2. Pragmatic Distinction

S →	VP →	NP	Version 3
Noun Phrase	Verb	Noun Phrase	Prep. + Noun Phrase
<b>Templates</b>			<b>Types</b>
Citing work	contextualize		with cited work's [X] <b>Contextualize</b>
	signals	gap	from cited work's [X] <b>Signal Gap</b>
	highlights	limitation	of cited work's [X] <b>Highlight Limitation</b>
	justifies	design choice	with cited work's [X] <b>Justify Design Choice</b>
	uses	cited work's [X]	<b>Uses</b>
	modifies	cited work's [X]	<b>Modify</b>
evaluates against			<b>Evaluates Against</b>

**[X] can be method,  
data, conclusion, or  
the work itself.**

## Our Solutions – 3. Classify Cited work's [X]

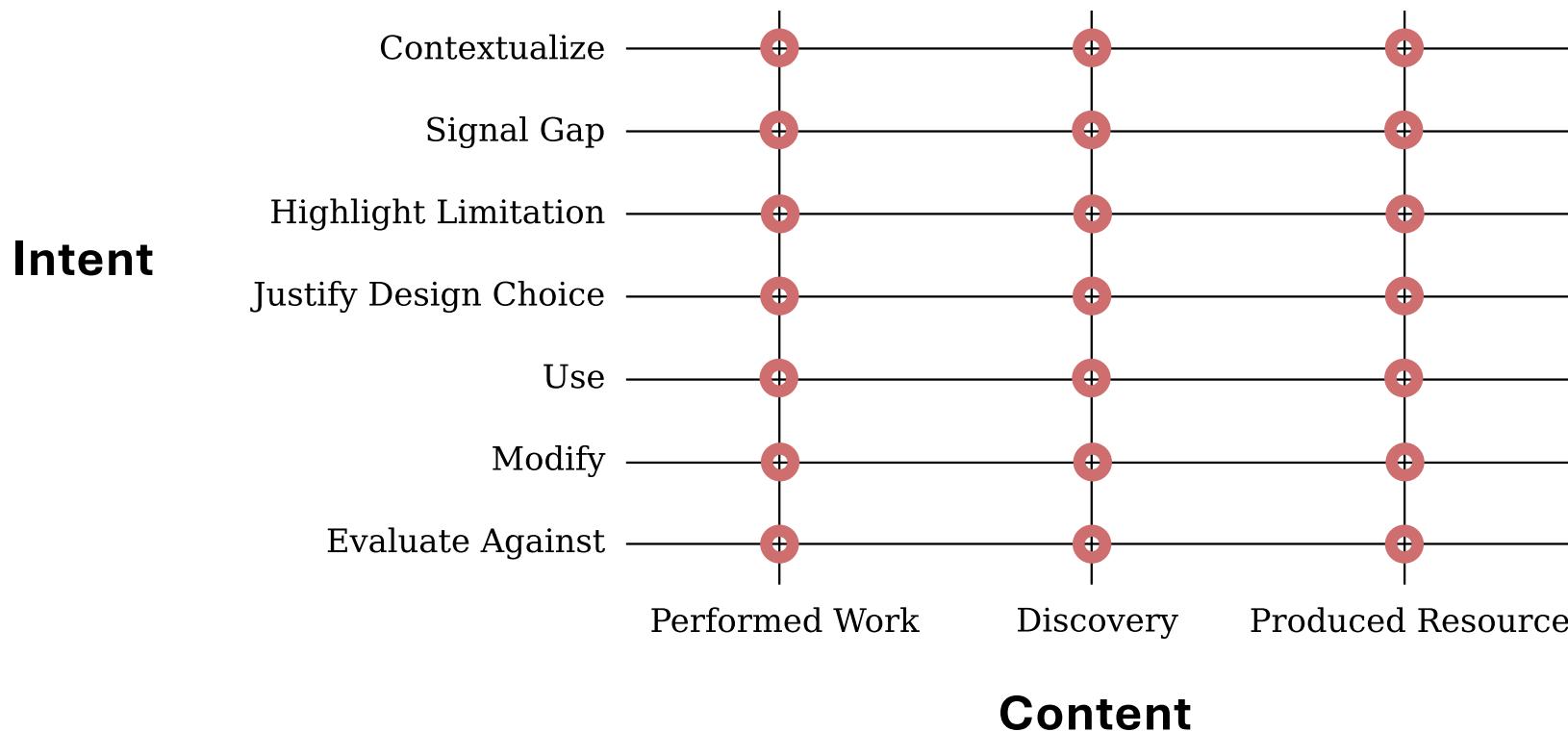
CFC (2006)	approach, methods, tools, algorithms, data, definitions	goals, results	the cited work
<a href="#"><u>CiTO (2010)</u></a>	method, data, solution	ideas, facts, assertion, conclusions, statements (factual evidence), information, excerpts	
Abu-Jbara et al. (2013)	approach, method, idea, tool	claims, results	the cited work
ACL-ARC (2018)	data, methods,	relevant information, goals	
SciCite (2019)	method, tool, approach, dataset	problem, concept, topic, results, findings	
ACT & ACT 2 (2020, 2022)	methodology, tools, data	information	

## Our Solutions – 3. Classify Cited work's [X]

	Produced Resource	Discovery (claims)	Perform Work
CFC (2006)	approach, methods, tools, algorithms, data, definitions	goals, results	the cited work
<a href="#"><u>CiTO (2010)</u></a>	method, data, solution	ideas, facts, assertion, conclusions, statements (factual evidence), information, excerpts	
Abu-Jbara et al. (2013)	approach, method, idea, tool	claims, results	the cited work
ACL-ARC (2018)	data, methods,	relevant information, goals	
SciCite (2019)	method, tool, approach, dataset	problem, concept, topic, results, findings	
ACT & ACT 2 (2020, 2022)	methodology, tools, data	information	

# Our Solutions – Final Framework: SOFT

**Semantically Orthogonal Framework with Two dimensions**



# Methodology: how to evaluate the new framework SOFT?

**Same Dataset:** ACL-ARC (Computational Linguistics domain; Train: 1647, Test: 284)

**Different Frameworks**

We used preprocessed dataset from CitePrompt, which

1. filtered out bad cases that without context.  
e.g. “[CITED\_AUTHOR].”
2. Ensure that duplicate contexts (pointing to different citations) do not appear in both the training and test sets.

# Methodology: how to evaluate the new framework SOFT?

**Same Dataset:** ACL-ARC (Computational Linguistics domain; Train: 1647, Test: 284)

## Different Frameworks

1. Original ACL-ARC Framework
2. **Mapped** to SciCite Framework

(using the mapping method described in SciCite's paper)

Uses	→	Method
Compare / Contrast	→	ResultComparison
Background	→	Background
Extends	→	Background
Motivation	→	Background
Future	→	Background

3. **Re-annotate** with SOFT

at least three annotators for each data entry, with master degree

# Methodology: how to evaluate the new framework SOFT?

**Same Dataset:** ACL-ARC (Computational Linguistics domain; Train: 1647, Test: 284)

**Different Frameworks**

An example

Citation context:

*“The last years have seen considerable advances in the field of anaphora resolution, but a number of outstanding issues either remain unsolved or need more attention and, as a consequence, represent major challenges to the further development of the field ([CITED\_AUTHOR]a).”*

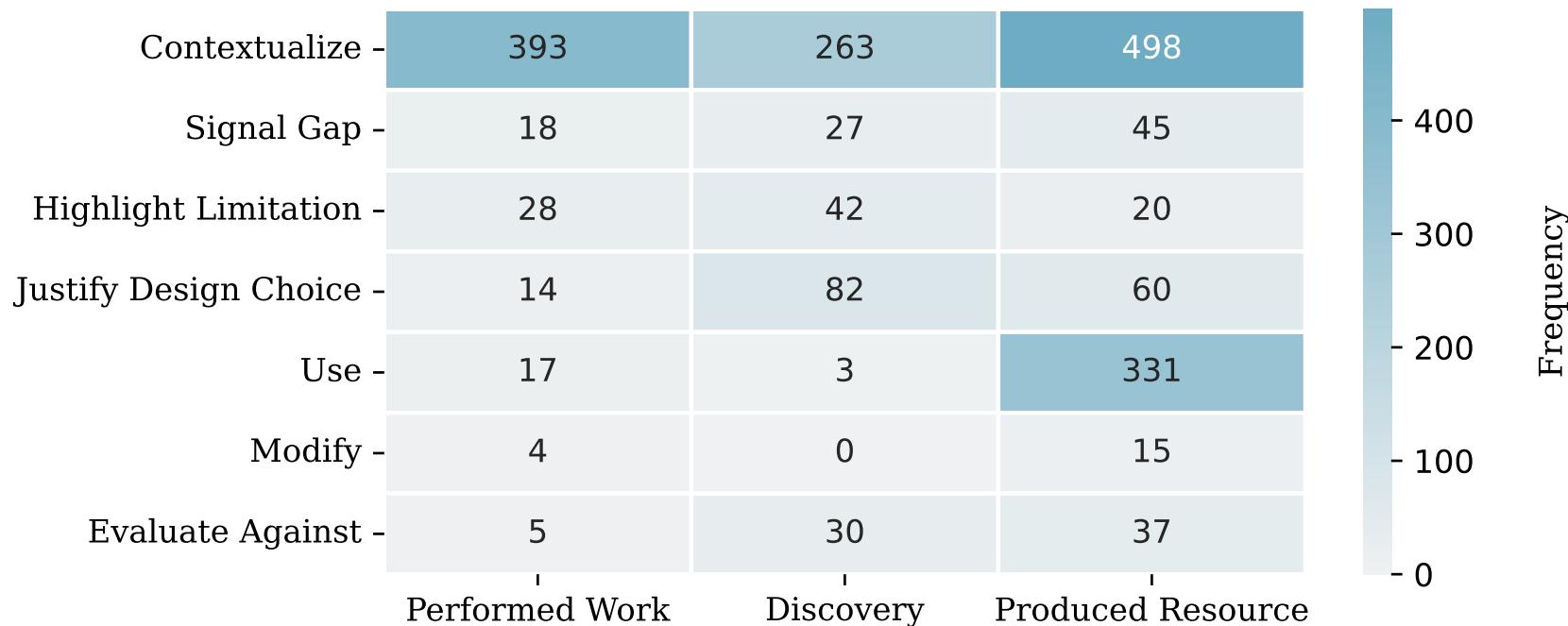
Framework	Type(s)
SciCite	Background
ACL-ARC	Motivation
<b>SOFT (Our Framework)</b>	Signal Gap (Intent), Discovery (Content)

# Methodology: how to evaluate the new framework SOFT?

**Same Dataset:** ACL-ARC (Computational Linguistics domain; Train: 1647, Test: 284)

**Different Frameworks**

**Re-annotate with SOFT - Statistics**



# Methodology: how to evaluate the new framework SOFT?

**Same Dataset:** ACL-ARC (Computational Linguistics domain; Train: 1647, Test: 284)

## Different Frameworks:

Original ACL-ARC, **Mapped SciCite**, **Re-annotate** with SOFT

## Same Automated Classification Method:

1. Fine-tuned Models GPU H100, 5 Hours in total  
SciBert (CitePrompt, 2023), Qwen-2.5-14B (CitationIntentOpenLLM, 2025)
2. Zero-shot LLMs GPU H100, 20 mins in total  
Qwen-2.5-72B, Llama-3.3-70B, Gemma-3-27B, Mistral-Small-24B

## Same Evaluation Metrics: Macro F1 Score

# Results

## Macro F1 Score

	<b>Classifiers</b>	<b>ACL-ARC</b> 6 types	<b>SciCite</b> 3 types	<b>SOFT (Content)</b> 3 types	<b>SOFT (Intent)</b> 7 types
Zero-shot	Llama	0.52	0.63	<b>0.67</b>	<b>0.72</b>
	Mistral	0.49	0.59	<b>0.62</b>	<b>0.71</b>
	Gemma	0.48	<b>0.63</b>	<b>0.68</b>	0.59
	Qwen	0.45	0.59	<b>0.67</b>	<b>0.75</b>
Fine-tuned	SciBERT	0.55	<b>0.69</b>	<b>0.70</b>	0.53
	Qwen-Small	0.51	0.61	<b>0.78</b>	<b>0.65</b>
Average		0.50	0.62	<b>0.69</b>	<b>0.66</b>

## Frameworks

1. **SOFT content** achieve **highest average** score.
  - 3 types SOFT content > 3 types SciCite
2. **SOFT Intent** retains comparable performance with 7 types.

# Results

## Macro F1 Score

	Classifiers	ACL-ARC 6 types	SciCite 3 types	SOFT (Content) 3 types	SOFT (Intent) 7 types
Zero-shot	Llama	0.52	0.63	<b>0.67</b>	<b>0.72</b>
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	Qwen	0.45	0.59	<b>0.67</b>	<b>0.75</b>
Fine-tuned	SciBERT	0.55	<b>0.69</b>	<b>0.70</b>	0.53
	Qwen-Small	0.51	0.61	<b>0.78</b>	<b>0.65</b>
Average		0.50	0.62	<b>0.69</b>	<b>0.66</b>

## Models

1. Content types (3) are easier for (fine-tuned) models to learn than Intent types (7).
2. Zero-shot LLMs perform better at handling intent types (7) than content types (3). (LLMs need more domain knowledge for understanding the terminology within the content?)

# Alternative Evaluations

## 1. Interpretability: evaluated by Inter-annotation Agreement

- Pairwise Cohen's  $\kappa$ : [-1, 1]  
(No agreement: <0, Poor: <0.2, Fair: <0.4, Moderate: <0.6, Good: <0.8, Perfect: <=1)
- Not reported by previous study (not fixed annotators group for each data entry)
- Annotators: LLMs, Human
- Calculate between: LLM-LLM, Human-LLM

# Alternative Evaluations

## 1. Interpretability: evaluated by Inter-annotation Agreement

- Pairwise Cohen's  $\kappa$ : [-1, 1]  
(No agreement: <0, Poor: <0.2, Fair: <0.4, Moderate: <0.6, Good: <0.8, Perfect: <=1)

ACL-ARC (6 types)

	Llama	Mistral	Gemma	Qwen
Mistral	0.5833			
Gemma	0.4504	0.3860		
Qwen	0.5776	0.6013	0.3600	
HUMAN	0.3956	0.4048	0.4302	0.3809

SciCite (3 types)

	Llama	Mistral	Gemma	Qwen
Mistral	0.6363			
Gemma	0.6855	0.6423		
Qwen	0.6762	0.7151	0.6928	
HUMAN	0.4016	0.3850	0.4618	0.4116

SOFT Content (3 types)

	Llama	Mistral	Gemma	Qwen
Mistral	0.5396			
Gemma	0.5751	0.5657		
Qwen	0.5496	0.6169	0.5717	
HUMAN	0.5193	0.4932	0.5901	0.5596

SOFT Intent (7 types)

	Llama	Mistral	Gemma	Qwen
Mistral	0.6154			
Gemma	0.5941	0.5949		
Qwen	0.6282	0.5887	0.6175	
HUMAN	0.6620	0.6070	0.6232	0.6918

# Alternative Evaluations

1. **Interpretability:** evaluated by **Inter-annotation Agreement**
2. **Generalizability:** evaluated on a cross-domain dataset

## **Dataset: ACT2**

- 19 disciplines (cross-domain)
- Randomly select 284 data entries from the ACT2's test set
- Mapped to SciCite, re-annotate with SOFT
- Tested on zero-shot LLMs and fine-tuned models trained on the ACL-ARC dataset

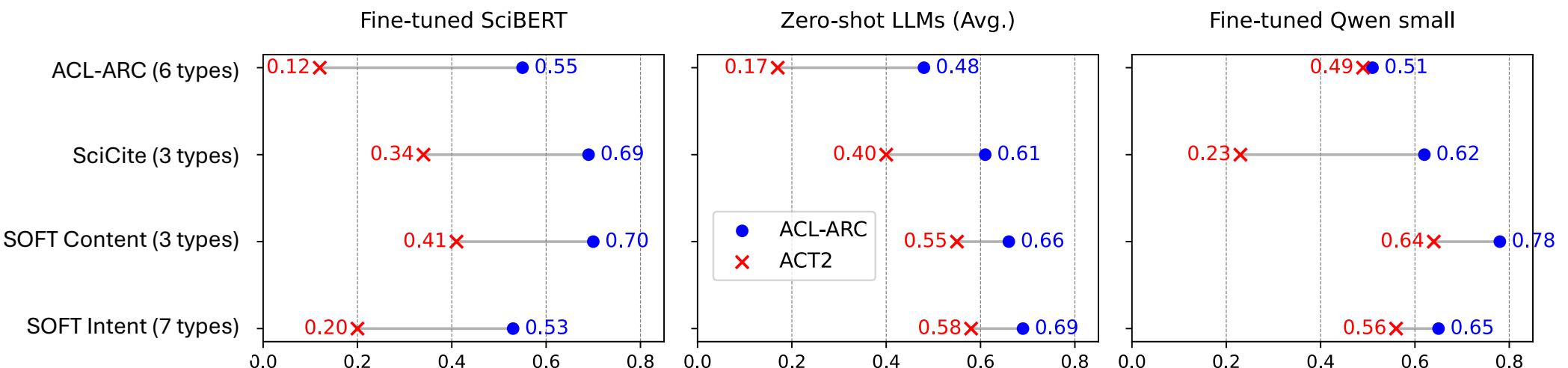
# Alternative Evaluations

1. **Interpretability:** evaluated by **Inter-annotation Agreement**
2. **Generalizability:** evaluated on a cross-domain dataset

● in-domain    ✗ cross-domain

highest Macro F1 Score:  
(cross-domain)

- SOFT Content: 0.64 (Fine-tuned Qwen small)
- SOFT Intent: 0.58 (Zero-shot LLMs)
- ACL-ARC: 0.49 (Fine-tuned Qwen small)
- SciCite: 0.40 (Zero-shot LLMs)



# Alternative Evaluations

1. **Interpretability:** evaluated by **Inter-annotation Agreement**
2. **Generalizability:** evaluated on a cross-domain dataset

## X cross-domain - Frameworks

- Both **SOFT Content** and **SOFT Intent drop less** than the other two framework
- Also achieve **obviously higher Macro F1 Scores** than the other two framework

	Classifiers	ACL-ARC 6 types	SciCite 3 types	SOFT (Content) 3 types	SOFT (Intent) 7 types	Avg.
Zero-shot	Llama	0.13 (75%↓)	0.37 (54%↓)	0.55 (18%↓)	0.57 (21%↓)	0.41 (42%↓)
	Mistral	0.16 (67%↓)	0.41 (31%↓)	0.46 (26%↓)	0.57 (20%↓)	0.40 (36%↓)
	Gemma	0.17 (65%↓)	0.36 (43%↓)	0.58 (15%↓)	0.55 (7%↓)	0.42 (33%↓)
	Qwen	0.23 (49%↓)	<b>0.45</b> (24%↓)	0.60 (10%↓)	<b>0.64</b> (15%↓)	<b>0.48</b> (25%↓)
Fine-tuned	SciBERT	0.12 (78%↓)	0.34 (51%↓)	0.41 (41%↓)	0.20 (62%↓)	<b>0.27</b> (58%↓)
	Qwen-Small	<b>0.49</b> (4%↓)	0.23 (63%↓)	<b>0.64</b> (18%↓)	0.56 (14%↓)	<b>0.48</b> (25%↓)
	Avg.	<b>0.22</b> (56%↓)	0.36 (44%↓)	<b>0.54</b> (21%↓)	<b>0.52</b> (23%↓)	

# Alternative Evaluations

1. **Interpretability:** evaluated by **Inter-annotation Agreement**
2. **Generalizability:** evaluated on a cross-domain dataset

## X cross-domain - Models

- Both zero-shot & fine-tuned **Qwen** achieved best performance
- **SciBERT** performed worst in the cross-domain task

	Classifiers	ACL-ARC 6 types	SciCite 3 types	SOFT (Content) 3 types	SOFT (Intent) 7 types	Avg.
Zero-shot	Llama	0.13 (75%↓)	0.37 (54%↓)	0.55 (18%↓)	0.57 (21%↓)	0.41 (42%↓)
	Mistral	0.16 (67%↓)	0.41 (31%↓)	0.46 (26%↓)	0.57 (20%↓)	0.40 (36%↓)
	Gemma	0.17 (65%↓)	0.36 (43%↓)	0.58 (15%↓)	0.55 (7%↓)	0.42 (33%↓)
	Qwen	0.23 (49%↓)	0.45 (24%↓)	0.60 (10%↓)	0.64 (15%↓)	0.48 (25%↓)
Fine-tuned	SciBERT	0.12 (78%↓)	0.34 (51%↓)	0.41 (41%↓)	0.20 (62%↓)	0.27 (58%↓)
	Qwen-Small	0.49 (4%↓)	0.23 (63%↓)	0.64 (18%↓)	0.56 (14%↓)	0.48 (25%↓)
	Avg.	0.22 (56%↓)	0.36 (44%↓)	0.54 (21%↓)	0.52 (23%↓)	