#### Grimjack at Touché 2022 Axiomatic Re-ranking and Query Reformulation

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## Motivation

#### Task 2: Comparative Argument Retrieval

Retrieve argumentative passages to assist decisions between 2 objects.

- Relevant
- High argument quality
- Sub task: Classify stance towards objects

#### Ideas and Questions

- Exploit argumentativeness through IR axioms [Bon+19; Bon+22a]
- Balance stances to prevent biased results [Che+21]
- Does T0++ zero-shot prompting work for argument retrieval? [San+21]

# Pipeline & Tools

- Pyserini pipeline [Lin+21]
- Query expansion with synonyms: fastText, T0++
- Query reformulation: T0++ [San+21]
- Candidate retrieval: query likelihood (Dirichlet)
- Argument quality & stance: IBM Debater [Tol+19] or T0++ prompting
- Axiomatic re-ranking: ir\_axioms [Bon+22a]



## Submitted Runs

1. Query Likelihood Baseline

Dirichlet smoothing, stance from IBM Debater (threshold 0.125)

#### 2. Argument Axioms

KWIKSORT re-ranking with 7 argumentative IR axioms

- 3. Stance-based Re-ranking with Argument Axioms balance stance exposure (pro A vs. pro B)
- All You Need is T0 expand & generate queries, estimate argument quality & stance by prompting T0++
- 5. Argumentative Stance-based Re-ranking with T0 expand & generate queries with T0++ and fastText, stance from IBM Debater, axiomatic and stance-based re-ranking

## Results

Retrieval

- Dirichlet baseline worse than BM25 baseline [Bon+22b]
- T0++ query expansion decreases nDCG@5
- stance-based re-ranking (balancing) can slightly increase nDCG@5
- re-ranking can't compensate the bad Dirichlet retrieval performance

Table: Relevance

Table: Quality

| Run nDCG                         |       | Run                              | nDCG@5 |  |
|----------------------------------|-------|----------------------------------|--------|--|
| Captain Levi best [Ran+22]       | 0.758 | Aldo Nadi best [Aba+22]          | 0.774  |  |
| Puss in Boots BM25 [Bon+22b]     | 0.469 | Puss in Boots BM25 [Bon+22b]     | 0.476  |  |
| Grimjack stance + axiom. re-rank | 0.422 | Grimjack stance + axiom. re-rank | 0.403  |  |
| Grimjack axiom. re-rank          | 0.376 | Grimjack stance + axiom + T0     | 0.365  |  |
| Grimjack baseline                | 0.376 | Grimjack axioms                  | 0.363  |  |
| Grimjack stance + axiom + T0     | 0.349 | Grimjack baseline                | 0.363  |  |
| Grimjack T0                      | 0.345 | Grimjack T0                      | 0.344  |  |

### Results

Stance Detection

- ► T0++ stance prediction achieves highest macro-averaged F<sub>1</sub>-score
- different number of ground-truth labels per team limits comparability
- with only top-5 (i.e., all approaches have ground-truth labels up to that depth): T0++ falls behind Team Levi's approaches
- unclear how to account for sampling bias

| Run                               | All            |      | Top-5          |     |
|-----------------------------------|----------------|------|----------------|-----|
|                                   | $\mathbf{F}_1$ | Ν    | $\mathbf{F}_1$ | Ν   |
| Grimjack T0                       | 0.313          | 1208 | 0.235          | 250 |
| Captain Levi best [Ran+22]        | 0.301          | 1688 | 0.359          | 250 |
| Grimjack axioms                   | 0.207          | 1282 | 0.180          | 250 |
| Grimjack baseline                 | 0.207          | 1282 | 0.180          | 250 |
| Grimjack stance + axiom. re-rank  | 0.207          | 1282 | 0.175          | 250 |
| Grimjack stance + axiom + T0      | 0.199          | 1180 | 0.168          | 250 |
| Puss In Boots always NO [Bon+22b] | 0.158          | 1328 | 0.159          | 250 |

# Conclusion

- heinrichreimer/grimjack
- ► T0 approaches rather unsuccessful for retrieval
- unclear evaluation wrt. stance classification
- balancing pro A and pro B arguments helps
- can't distinguish neutral from no stance

#### Future Work

- Dirichlet vs. BM25
- reproduce & evaluate stance prediction on independent test dataset

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Thank you!

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#### References

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#### Axiomatic Re-ranking with ir\_axioms [Bon+22a]

- ΚωικSort: re-rank based on pairwise axiomatic preferences
- majority vote: only if  $\geq 50$  % axioms agree, change ranking

| Name            | Description  |
|-----------------|--|
| ArgUC [Bon+18]  | Prefer more argumentative units.                           |
| QTArg [Bon+18]  | Prefer more query terms in argumentative units.            |
| QTPArg [Bon+18] | Prefer earlier query terms in argumentative units.         |
| CompArg         | Prefer more comparative objects in argumentative units.    |
| CompPArg        | Prefer earlier comparative objects in argumentative units. |
| aSLDoc [Bon+19] | Prefer passages with 12–20 words per s15-18entence.        |
| ArgQ            | Prefer higher argument quality.                            |

## Query Reformulation with T0++ [San+21]

- prompt: <text>. Extract a natural search query from this description.
- with <text> being the topic description (D) or narrative (N)

| Торіс                                       | Field | Generated query   |
|---|-------|---|
| Train or plane? Which is the                | D     | Travel  |
| better choice?                              | Ν     | What are the benefits of trains over planes for inter-<br>continental travel? |
| Should I major in philosophy or psychology? | D     | What is the difference between philosophy and psychology?                     |
|   | Ν     | What are the benefits of a major in English or history?                       |