

Are You There God? Lightweight Narrative Annotation of Christian Fiction with LMs

Rebecca M. M. Hicke¹ , Brian W. Haggard² , Mia Ferrante¹, Rayhan Khanna¹, and David Mimno³ 

¹ Department of Computer Science, Cornell University, Ithaca, NY, USA

² Department of Sociology, Cornell University, Ithaca, NY, USA

³ Department of Information Science, Cornell University, Ithaca, NY, USA

Abstract

In addition to its more widely studied cultural movements, American Evangelicalism has a well-developed but less externally visible literary side. Christian Fiction, however, has been little studied, and what scholarly attention there is has focused on the explosively popular *Left Behind* series. In this work, we use computational tools to provide both a broad topical overview of Christian Fiction as a genre and a more directed exploration of how its authors depict divine acts. Working with human annotators, we first developed a codebook for identifying “acts of God.” We then adapted the codebook for use by a recent, lightweight LM with the assistance of a much larger model. The laptop-scale LM is largely capable of matching human annotations, even when the task is subtle and challenging. Using these annotations, we show that significant and meaningful differences exist between divine acts depicted by the *Left Behind* books and Christian Fiction more broadly.

Keywords: LLM-assisted annotation, narrative analysis, American Evangelicalism, christian fiction, gender

1 Introduction

The American Evangelical movement has achieved considerable cultural power over the past several decades. Accordingly, there has been extensive research on Evangelicalism’s historic evolution and efforts to challenge American secularism [6; 15; 17; 21; 33; 45; 51]. However, Evangelical ministry is overwhelmingly male-dominated and, therefore, studies of it center the masculine Evangelical approach to asserting Christian cultural dominance [15]. Christian Fiction, a female-dominated domain [10], has received far less academic study despite having wide readership and billions of dollars in sales [44]. It formally established itself as a genre in the 1970s, creating a Christian alternative to mainstream secular entertainment [23]. Christian Fiction authors occupy a unique position within American Christianity; when they depict God acting in their stories – speaking to characters, answering prayers, intervening in crises – they make consequential spiritual and creative choices about divine character and behavior. Existing scholarship on Christian Fiction has been limited and skewed towards the commercially dominant *Left Behind* series [2; 9; 12; 18; 23; 32; 37; 48]. Written by two men in the turn of the 20th century, this apocalyptic series does not represent what Christian Fiction is today: a women-dominated industry of primarily contemporary and historical romance, producing hundreds of titles annually that center women’s spiritual lives and everyday faith [38].

Rebecca M. M. Hicke, Brian W. Haggard, Mia Ferrante, Rayhan Khanna, and David Mimno. “Are You There God? Lightweight Narrative Annotation of Christian Fiction with LMs.” In: *Computational Humanities Research 2025*, ed. by Taylor Arnold, Margherita Fantoli, and Ruben Ros. Vol. 3. Anthology of Computers and the Humanities. 2025, 961–984. <https://doi.org/10.63744/U7SMpKE7aJs1>.

© 2025 by the authors. Licensed under Creative Commons Attribution 4.0 International (CC BY 4.0).

In this paper, we seek to provide a contemporary overview of Christian Fiction using computational methodologies. We study a corpus of 88 novels: 80 that won or were short-listed for a Christy Award, offered by the Evangelical Christian Publishers Association for excellence in Christian Fiction, and the remaining 8 novels from the *Left Behind* series.¹ We begin by characterizing the main themes of these works using an established method, statistical topic modeling. We find that the collection encompasses a wide range of themes, only some of which are distinctively Christian. The *Left Behind* books differ significantly from the rest of the collection along several thematic axes. Moreover, even when the *Left Behind* books are removed from the corpus, themes depicted by male and female authors differ in traditionally gendered ways. Next, we identify and characterize how authors portray acts of God in their stories. To do this, we adapt human annotation prompts for use with a small, lightweight LM (Gemma 3n) using a much larger model (GPT-4o). Again, we find that the *Left Behind* novels stand out from the rest of the corpus; they feature acts of God significantly more frequently, depict more divine acts that affect groups, and are more likely to characterize those acts as punishing.

Overall, we show that the frequently spotlighted *Left Behind* series is not representative of the general themes of Christian Fiction or its typical portrayal of divine intervention; instead, the authors who dominate the contemporary Christian Fiction landscape portray a loving God who overwhelmingly intercedes on the behalf of individuals. We also find some differences between contemporary male and female authors; namely, women authors focus more on joyful depictions of affection and less on violence than their male counterparts. Finally, this paper demonstrates that large, contemporary LMs can be used to effectively adapt human annotation prompts for use with smaller LMs, even for highly subtle and complex narrative phenomena.

2 Background

2.1 Evangelicalism + Christian Fiction

Evangelicalism as an American religio-cultural movement defies simple categorization, with scholars offering a variety of overlapping yet distinct definitions [8; 17; 20; 44]. Despite this debate, Evangelicals are generally distinguished from the broader Christian community by several core beliefs: upholding the Bible as the ultimate spiritual authority that should be read and interpreted literally, experiencing a born-again conversion or moment of salvation, celebrating the centrality of Christ’s atonement, and actively working to spread their faith [15; 38; 52]. Christian Fiction specifically gained momentum in the 1970s as American Evangelicalism emerged as a mainstream cultural movement responding to social upheaval around race, gender, and sexuality [37]. Rather than shunning mainstream culture as earlier Christian Fundamentalists had done, Evangelicals increasingly encouraged the creation of alternatives from secular consumption, contributing to the growth of the genre.

Twentieth-century Evangelicalism intensified patriarchy and women’s exclusion from formal ministry even as broader American culture moved toward equality [3; 15]. However, Christian Fiction represents one of the few spaces within the Evangelical movement where women can exercise ministerial authority. Authors within this genre describe their writing as divine calling, positioning themselves as spiritual vessels using narrative to facilitate readers’ encounters with their faith. Following pioneers like Janette Oke who established the legitimacy of Christian romance, contemporary authors understand their creative process as fundamentally spiritual, involving prayer and calling for God’s guidance when developing plot and character. Readers engage with these texts as devotional practice, using fiction to maintain faith and understand God’s character [18; 38; 40; 44]. This creates “a ministry by, for, and about women” [38, p. 108] operating outside institutional structures that formally restrict women’s spiritual leadership.

¹ Four novels from the 12 book series were included in our initial 80-book sample of Christy Award honorees.

Examining how authors portray God’s actions allows us to directly study their perceptions of God. Authors make consequential choices about divine behavior within their narratives: how God speaks, what motivates divine intervention, how God responds to suffering, and more [9; 14]. These choices reflect authors’ theological convictions; authors would not write God acting in ways they consider blasphemous or contrary to scripture. When an author depicts God comforting an individual, calling a nation to repentance, or remaining silent during tragedy, they therefore communicate their understanding of God to readers. These narrative patterns thus reveal how Evangelical women conceptualize and teach about God’s relationship to humanity, offering insight into women’s religious expression.

Within Christian Fiction, the *Left Behind* series by Tim LaHaye and Jerry B. Jenkins in particular has come to dominate both the market and the scholarly understanding of the genre. *Left Behind*’s success cannot be understated. It sold over 80 million copies and thrust the once niche Christian Fiction industry into the mainstream [13]. The 12 book series depicts a prophetic future for the world informed by LaHaye’s literalist interpretation of the Book of Revelation [48]. The series explores how the End Time descends upon the world as the Antichrist battles for control over the planet and is set within a soon approaching future, incorporating real locations, governments, and political parties. The series generated substantial academic attention that still constitutes the bulk of research on Christian Fiction. This includes discussion of the books’ perspective on Christian faith [22; 23], race [34], gender [9], and politics [12; 37]. Yet the singular focus of this scholarship presents a significant problem; *Left Behind* is not representative of Christian Fiction. The series is increasingly outdated — the final book in the *Left Behind* series was released over 20 years ago. More importantly, *Left Behind* was co-authored by a prominent figure in Evangelical political movements and its apocalyptic narrative contains patriarchal themes potentially unrepresentative of the novels that define contemporary Christian Fiction [9; 15]. While some scholarship has addressed more general trends in Christian Fiction [44] or women-dominated genres [4; 38], these studies remain limited in their examination of the broader Christian Fiction community. These studies also focus on a very small number of texts, limiting their generalizability.

2.2 Narrative Analysis with LMs

Language models are increasingly being used for narrative analysis tasks. Many studies have employed a variety of prompting strategies with large, generative LMs for narrative analysis tasks involving character relationships, roles, and traits [1; 7; 26; 31; 42; 54]; narrative flow and style [24; 47]; and much more [27; 28; 29; 36; 43; 46]. These studies often rely on human annotation and inter-annotator agreement to assess how closely LM judgments align with human readers [27; 41]. While some studies find LM performance to exceed baselines and show great promise for narrative understanding [26], others find LLMs struggle with subtext and ambiguity. For example, while LMs can often produce plausible narrative summaries or identify who said what in a dialogue, they still frequently struggle with deeper interpretive tasks that involve implicit reasoning or contradictory cues [27].

Our work builds on this growing area of research by applying LLMs to a deeply nuanced interpretive task: identifying instances of divine intervention in Christian Fiction. This task extends beyond plot analysis, requiring theological insight and cultural context. We know of no existing research which uses LLMs to study narrative and faith in Christian Fiction.

2.3 Automatic Prompt Generation

Researchers have recently explored automatic prompt generation with LLMs. Honovich et al. [25] evaluate models ability to produce task instructions by using generated instructions as model prompts. Several studies have used LLMs to produce and improve natural language prompts [11;

16; 50; 53; 55]. However, no work we are aware of uses human and model collaboration to iteratively refine narrative analysis prompts for smaller LMs.

3 Data

	Christy Award Corpus	Our Corpus
# Texts	647	80
# Publishers	75	12
# Unique Authors	335	71
% Female Authors*	76%	74%
% Male Authors*	23%	26%
# Award Categories	21	18
% Multi-Award Nominees	4.5%	15%

Table 1: Descriptive comparisons of our subcorpus (right) vs. the entire list of Christy Award honorees (left). Statistics marked with a * exclude novels co-authored by a male and female author.

Our corpus includes 80 Christian Fiction novels by 71 authors published between 2000 and 2023. These books are sampled from a comprehensive list of Christy Award book winners and finalists published between 2000 and 2024. The Christy Award was established by the Evangelical Christian Publishers Association in 1999 to celebrate faith-based novels’ impact on contemporary culture. Books honored by the Christy Award have been acknowledged as both high quality and culturally significant within the Evangelical community. By studying these books we ensure our sample represents the most influential and respected voices in Christian Fiction.

The full corpus of Christy Award honorees comprises 647 titles from 75 publishers. Over 25 years, awards have been given in 22 distinct categories ranging from ‘First Novel’ to ‘Suspense’ and ‘North American Historical.’ Approximately three-quarters of Christy Award honorees were authored only by women.² In our dataset, we include all Book of the Year awardees from 2014 to 2023. The remaining 70 books we sample from the 17 other award categories of interest,³ prioritizing ebook accessibility. Our corpus includes novels from 12 publishers, five of which account for over 61% of Christy Award honorees.⁴ As in the collection of all honorees, three-quarters of the books in our subset were authored by women. The number of books we sampled from each award category can be found in Appendix A.2. 15% of books in our corpus won multiple Christy awards, compared to 4.5% in the entire dataset, because all Book of the Year awardees by definition won another award in the same year. An overview comparison of our subsample to the entire set of Christy Award honorees can be found in Table 1.

To the set of 80 Christy Award honorees, we add the remaining eight novels from the main *Left Behind* series (12 books total) to facilitate comparison between this series and the Christian Fiction genre more broadly. The additional books were published between 1995 and 2004 by Tyndale House Publishers. Details on all 88 books in our corpus can be found in Appendix A.1.

² Some books were co-authored by male and female authors and are excluded from this count. A breakdown of the proportion of honorees written women for each award category can be found in Appendix A.3.

³ The three excluded categories are the Amplify Award (only given in 2022 and 2023), Lits (only given in 2007 and 2008), and Short Form (which includes novellas and short stories, but not novels).

⁴ These publishers are: Bethany House Publishing, Revell / Baker Publishing Group, Thomas Nelson, Tyndale House Publishers, and WaterBrook Multnomah Publishing Group

4 Methods

Our goal is to observe and quantify the thematic contents of our collection of Christian Fiction, particularly the characterization of the divine. We approach this question from both a broad, unsupervised perspective and from a more specific, targeted perspective. These goals require different methodologies.

4.1 Topic Modeling

For the broad thematic perspective, we find that a standard LDA topic model [5] is both effective and well-established. We used the Mallet toolkit [35] with hyperparameter optimization for α and β . We chose the granularity of topics ($K = 65$) by inspection for a contextually appropriate balance between comprehensiveness and specificity.

Because we are working with long-form fiction, we preprocess the novels in two ways. First, we divide each novel into 300 word segments. This scale results in 29,000 “documents” rather than 88, which provides more statistical support for thematic analysis. Second, we use the Authorless Topic Models method [49] to reduce the impact of novel-specific character names and settings and emphasize themes that occur across multiple works. This step is similar to a contextual stopword list, but rather than fully removing words it stochastically reduces the frequency of overrepresented words in specific novels. Together with a customized stopword list, these preprocessing steps reduce the number of word tokens from roughly 8.8 million to 2.8 million.

4.2 Identifying Acts of God

For a more focused analysis, we sought to identify and characterize acts of God in our corpus. Though the books are fictitious, guidelines for publishing Christian Fiction [10] and authors’ unwillingness to inaccurately portray God lead to stories that represent the authors’ religious beliefs. This contributes to the blurring of the line between sacred and fictional aspects of Christian Fiction [18; 23; 40; 48]. Identifying and classifying these acts of God required both significant interdisciplinary scholarship and sophisticated contemporary language models.

4.2.1 Codebook Creation

For annotation, we split the books in our corpus into ≤ 500 word passages. 500 words constitute about two average novel pages; using passages of this length allows us to provide annotators with contextually rich passages while staying within the high-performing context lengths of smaller LMs. We preserve chapter and section breaks in the novels to further increase the coherency of passages. This results in 20,440 unique passages. On average, there are 232.27 passages per volume, with a minimum of 29 passages⁵ and a maximum of 473 passages.⁶ The passages are between 2 and 500 words long, with an average length of 430.80 words.

The codebook and annotations were created by a team of ten: the lead authors with degrees in literature, sociology, and computer science and eight undergraduates with a variety of religious and academic backgrounds. Initially, we expected the coding task to be straightforward; the undergraduates were instructed to code a passage as “Yes” if God explicitly acted and “No” otherwise. However, the Krippendorff’s α scores [30] for the first two annotations rounds were very low (0.36 and 0.48). Perhaps unsurprisingly, we found that God’s presence in Christian Fiction narratives is multidimensional and often challenging to concretely identify. We also found that students’ familiarity with and relationship to Christian theology dramatically changed their interpretations of what was considered an “act” of God. To develop a unified and concrete understanding of Evangelical depictions of God, the team spent two semesters meeting weekly. Students were assigned

⁵ *Candle in the Darkness* by Lynn Austin

⁶ *The Indwelling* by Jerry B. Jenkins and Tim LaHaye

relevant literature on American Christianity, Evangelicalism, and Christian Fiction to establish a common language and knowledge of the topic. Each week, students were tasked with coding a set of passages and asked to present on passages they found challenging.

Student feedback and extensive discussions among the entire team resulted in several key changes to the codebook. First, we decided that it was important to code from an Evangelical perspective. This meant that a passage was labeled “Yes” whenever an action was attributed to God, however mundane. Therefore, we included actions ranging from thanking God for providing a delicious meal to God sending apocalyptic plagues. Second, the adoption of the Evangelical perspective meant that the Bible was considered the literal word of God and Bible quotes or stories describing God’s actions were labeled “Yes.” Finally, we introduced a “Maybe” label to cover edge cases. These changes resulted in an increase in inter-rater reliability to $\alpha \geq 0.65$. Given the difficulty of task and the large number of annotators, we considered this sufficient.

We chose the ≤ 500 word segmentation method because it was unambiguous and could be implemented quickly and accurately, but there are both technical and literary complications. In some cases, acts of God would fall across the segmentation boundaries, making them difficult to accurately identify. There were also potential acts of God that would later be revealed as intentional misdirection by the author. Since annotators only used passage-level context, these acts would still be labeled “Yes.” Finally, narrative-specific references to God’s actions may have been missed because the coders were not familiar with the entire texts. We do not believe, however, that these issues were common enough to threaten the validity of our results.

Overall, the annotation process resulted in 1,951 unique coded passages from 67 novels. Of these passages, 1,679 (86.06%) were labeled as *not* containing acts of God, 191 (9.79%) were labeled as containing acts of God, and 81 (4.15%) were labeled as possibly containing acts of God. All passages were initially coded by at least two separate undergraduate annotators. All annotator disagreements were discussed and resolved by the lead authors.

4.2.2 Annotation with LLMs

In order to identify acts of God in the entire corpus, we transform the instructions designed for human annotators into two zero-shot prompts, which we then apply using Gemma 3n (e4b) quantized to 4 bits [19].⁷ We selected Gemma 3n (e4b) for two reasons. First, we intend this method to be accessible to researchers without significant computer resources; when quantized, the Gemma 3n model can be run on a personal laptop using systems like Ollama for no additional cost. All experiments for this paper are run on a desktop AMD Ryzen 7 CPU, RTX 4070 GPU, and 32 GB RAM.⁸ Second, because this project studies copyright-protected data, we avoid using any models that require upload to a cloud system or that may ingest novel excerpts as training data. Temperature was set to 0 to optimize the model’s performance for accuracy

To convert the original annotator instructions (Appendix B.1) into a set of zero-shot prompts optimized for Gemma 3n, we first simplified the language and syntax, removed redundant instructions, and specified output format. We asked the model to respond with a) an explanation of which label it will choose, b) the label itself, and c) a description of the act of God and who it affects. We used JSON-formatted structured outputs to ensure that the model would provide answers for all three parts and only respond with a recognized label. Next, we used GPT-4o [39] interactively to make iterative refinements to the prompt by instructing it to optimize changes to the prompt for a small model, specifically Gemma 3n. GPT-4o further simplified the language in our prompt and introduced additional formatting to add structure.

After each round of changes to the prompt, we tested it on a subset of the evaluation corpus (50

⁷ The model was accessed via Ollama.

⁸ Although a more powerful device was used to speed up inference, the experiments also run successfully on a 2022 Macbook Pro with an M2 chip.

You will be given a short passage from a novel. Decide if the Christian God (including Jesus and the Holy Spirit) is acting in the passage or if an act of the Christian God is described.

Answer YES if:

- The Christian God is doing or has done something (e.g., speaks, loves, blesses, heals, harms)
- A character says that the Christian God has done something
- An act of God described in the Bible happened or is happening now
- A miracle or conversion occurs

Answer NO if:

- Someone talks about the Christian God but He does not do anything in the passage
- A person prays to or addresses the Christian God but He does not answer or act
- The text describes something the Christian God will or might do later
- The scene has Christian content or atmosphere, but no divine action is described

****REMEMBER:****
Say YES only if the passage shows or strongly says that the Christian God acted. Do not say YES just because the scene includes religion, prayer, or mystery.

Please respond with:

- act_of_god_explanation: Explain why you chose YES or NO, using the rules above.
- act_of_god_label: YES or NO
- act_of_god: If your answer was YES, state explicitly in one to two sentences what the act of the Christian God is and who is affected by it.

```
<text>
[INSERT TEXT HERE]
</text>
```

The following novel passage contains an extraordinary event that is either due to the Christian God / Jesus / the Holy Spirit or another supernatural or magical source, like those found in science fiction or fantasy novels. Miracles, conversions, and Biblical events or quotes count as acts of the Christian God unless another source is specified. You will be asked to label the passage: YES if it describes an act from the Christian God and NO if the act is otherwise supernatural or magical.

****NOTES****:

- If any event or act depicted or mentioned in the passage is due to the Christian God, label the passage as YES.
- God is only responsible for an act if the passage has explicit religious content.

Please respond with:

- act_of_god_explanation: Explain why you chose YES or NO.
- act_of_god_label: YES or NO

```
<text>
[INSERT TEXT HERE]
</text>
```

Figure 1: The two zero-shot prompts used to identify acts of God.

random excerpts labeled “Yes,” 50 labeled “Maybe,” and 50 labeled “No”). Based on observed trends in the model responses, the lead authors and GPT-4o made further adjustments to the prompt. In a few cases, we passed specific passages along with the Gemma 3n label explanations to GPT-4o as examples of common mistakes. During this iterative process, the descriptions for each label were heavily edited; instructions were added to catch common mistakes and notes addressing uncommon edge cases were removed to avoid overwhelming the model. In addition, we chose to remove the “Maybe” label from the prompt because the distinctions between “Yes” and “Maybe” were very challenging for Gemma 3n. All “Maybe” labels in the evaluation dataset were converted to “Yes.”

The model also repeatedly struggled to distinguish between acts of God and other supernatural or magical events, like those depicted in science fiction or fantasy novels. Our attempts to clarify this distinction in the original prompt led to decreased model performance for other passages. Therefore, we introduced a second prompt to the classification pipeline that asked the model to clarify between acts of God and supernatural events. All passages labeled “Yes” by the original classifier were fed to the second prompt; passages only received the final “Yes” label if both prompts labeled them “Yes.” The second prompt went through the same iterative editing process by GPT-4o and the research team. The final versions of each prompt are available in Figure 1.

The classification pipeline achieved an overall F1 score of 0.87 on the entire dataset (Table 2). We consider this an impressive result for such a subtle and complex task. However, although the recall for both labels is high, we find that the model continued to over-label passages as “Yes.” Specifically, it often labeled passages in which a character prayed or otherwise spoke to God as “Yes,” although the passage did not include any implied or explicit *response* by God. For an annotation task as nuanced as this, a small LM the size of Gemma 3n is still limited in its capacity. Despite this, we find that iterative editing by the lead authors and a large, powerful LM converted human annotator instructions into a successful prompt for a smaller, accessible LM that allowed for nuanced analysis on a previously infeasible scope.

	Recall	Precision	F1
Yes	0.84	0.52	0.64
No	0.87	0.97	0.92
Overall	-	-	0.87

Table 2: Gemma 3n’s performance on the evaluation dataset using the prompts in Figure 1.

4.3 Characterizing Acts of God

To further characterize the acts of God identified by the classification system described above, we designed two further prompts for Gemma 3n. These prompts seek to identify who is affected by each act of God (individuals or groups) and whether God’s action is loving, punishing, both, or neutral. Again, we begin with prompts written for human annotators and transform them for use with Gemma 3n using GPT-4o. Both prompts take as input the descriptions of God’s acts output by the primary classifier. Final versions of both prompts can be seen in Appendix B.2.

To evaluate the efficacy of these prompts, the lead authors reviewed their responses to the first 100 passages in the evaluation dataset labeled as “Yes” by both the original classifiers and human annotators. We found the annotators agreed with 81% of the labels identifying who an act affected and 88% of the labels characterizing acts. However, the labels “Individual” and “Loving” were over-represented in the annotated set (likely because they are over-represented in the entire corpus) and, moreover, were over-predicted by the model. Despite this, we determined that the classifiers provided a strong enough signal to be used for further analysis.

5 Characterizing Christian Fiction

We focus on two primary trends in our topic modeling results: expression of faith and portrayal of gender.⁹ We identify four faith-related topics: Confessional Prayer (#13: *believe, father, please, forgive*), Glorifying God (#43: *God, heaven, salvation, amen*), Apocalyptic Faith (#48: *Israel, tribulation, death, messiah*), and Congregation Worship (#63: *church, Sunday, music, sermon*). Surprisingly, these topics are comparatively rare despite the overall importance of faith in the genre (Appendix C.2). Glorifying God and Apocalyptic Faith are highly positively correlated (Pearson’s R: 0.84, $p < 10^{-21}$),¹⁰ but no significant correlations exist between the other faith categories; this suggests that distinct faith styles are employed by authors.

We also identify five topics tied to complementarianism, the theological argument that men and women were created to serve distinct roles, with men taking on leadership positions in the household and wider society while women primarily serve the family unit. These topics are Food and Cooking (#1: *food, kitchen, meal, hungry*), Family Members (#4: *family, father, children, parents*), Family Relationships (#8: *mom, dad, father, kids*), Motherhood and Pregnancy (#27: *baby, mother, pregnant, birth*), and Cleaning the Home (#34: *clean, bathroom, towel, wet*). Prevalence of the Cooking, Family Relationships, and Cleaning the Home topics are all significantly positively correlated as are Family Members and Motherhood and Pregnancy. The relationships between these topics suggests that Christian Fiction depicts an idealized lifestyle for Evangelical women that emphasizes domesticity [15].

These topic groupings provide evidence that the *Left Behind* series differs considerably from Christian Fiction more broadly. Although there is no significant difference between the prevalence of the Confessional Prayer and Congregation Worship topics in the *Left Behind* books and the broader corpus, both the Glorifying God (4.51 vs. 1.38, $p < 10^{-17}$) and Apocalyptic Faith (5.39 vs. 0.41, $p < 10^{-37}$) topics were significantly more dominant in the *Left Behind* books.¹¹ The *Left Behind* series also features Cooking and Cleaning the Home at significantly lower frequencies than the rest of the corpus.¹² It is unclear whether these differences stem from *Left Behind*’s apocalyptic setting or gendered preferences in writing.

To pursue this question, we examine whether the prevalence of these topics differs significantly in books written by female and male authors. To do this, we exclude all *Left Behind* novels and

⁹ A full list of topics and associated keywords can be found in Appendix C.1.

¹⁰ All p -values reported have had Bonferroni correction applied using the `statsmodels` package to account for multiple similar statistical tests being run on the same dataset.

¹¹ Independent t-tests for difference in means were performed using `sklearn`

¹² #1: 0.45 vs. 1.75, ($p < 0.01$), #34: 0.37 vs. 0.77 ($p < 0.05$)

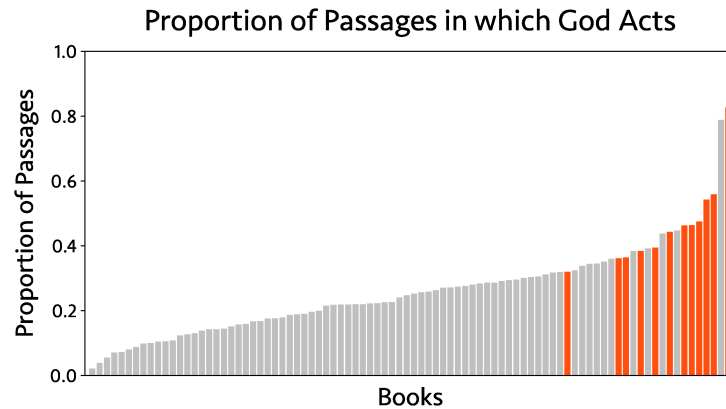


Figure 2: Novels sorted by proportion of passages labeled as containing acts of God by our classification pipeline. The *Left Behind* novels, shown in orange, have some of the highest proportions.

books co-written by a male and female author from the dataset. We find no significant differences between topic prominence between male and female authors for any of the four faith-focused topics or any of the five topics tied to complementarianism. However, we do see that women authors depict Joyful Affection (#2: *love, smile, kiss, joy*) more on average (1.02 vs. 1.99, $p < 0.05$) and Violence (#23: *blood, body, gun, dead*) less on average (5.30 vs. 3.16, $p < 0.05$) than male authors, which aligns with standards of Evangelical femininity.

Overall, we identify three primary patterns in the topic model: the *Left Behind* series approaches faith in a distinct way, this difference in religious portrayal is not due to gender — male and female authors portray faith to similar extents, but an author’s gender does shift the prevalence of some gendered topics. This makes clear the divide between the intensely religious themes of the *Left Behind* series and more contemporary Christian Fiction.

6 Identifying Acts of God

Of all the passages in our corpus, 24.9% or 5,086 are labeled as containing acts of God. On average, 26.1% of passages from each novel contain an act of God; however, this value ranges from 2.1%¹³ to 82.6%¹⁴ across all novels (Figure 2). This demonstrates that, although these books are positioned in an explicitly religious subgenre often assumed to contain religious indoctrination, there is actually wide variation in how frequently authors portray acts of God.

We find that two of the four faith topics — Glorifying God (Pearson’s R: 0.88, $p < 10^{-28}$), and Apocalyptic Faith (Pearson’s R: 0.71, $p < 10^{-13}$) — significantly correlate with the frequency of divine action. When the *Left Behind* novels are removed from the dataset, these correlations hold¹⁵ and a significant relationship between the frequency of divine action and Confessional Prayer emerges.¹⁶ However, no such significant relationship exists for Congregation Worship. This highlights that explicit actions of God occur more frequently in books which emphasize individualized expressions of faith, which aligns with American Evangelicalism’s hyper-individualistic tendencies.

We also see that acts of God are more densely clustered later in novels (Figure 3). On average, acts of God appear 56.2% of the way through a plot. There are two possible explanations for this. First, acts of God may simply serve as important narrative events, which frequently occur towards

¹³ *Auralia’s Colors* by Jeffrey Overstreet

¹⁴ *Glorious Appearing* by Jerry B. Jenkins and Tim LaHaye

¹⁵ #43 – 0.82 ($p < 10^{-18}$), #48 – 0.55 ($p < 10^{-5}$)

¹⁶ 0.38, $p < 0.05$

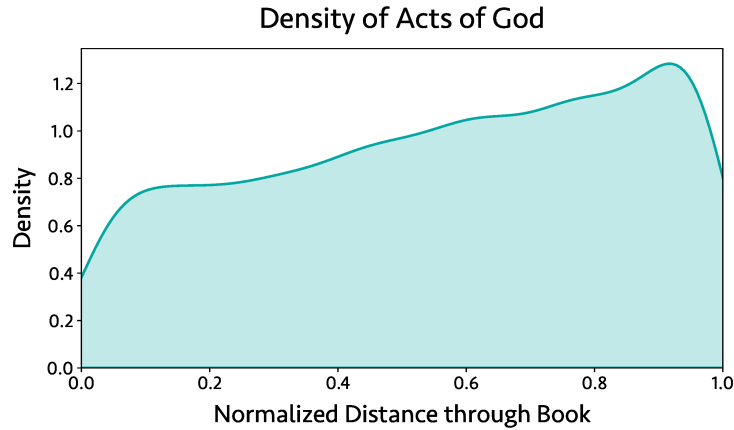


Figure 3: The frequency of acts of God over normalized novel progression. Acts can occur at any point, but are more frequent later in novels.

the end of novels. Second, Christian Fiction authors may wish to defer “religious talk” to a point where readers are invested in the characters or plot, so as to avoid putting off secular readers. This approach serves to increase readership, but also serves a spiritual goal of introducing non-Christian readers to Christian values and viewpoints.

Finally, we see that there is no significant difference between the frequency with which male and female authors depict acts of God. However, a significantly higher proportion of passages from the *Left Behind* novels depict acts of God on average (46.6% vs. 22.85%, $p < 10^{-9}$);¹⁷ this is clearly visible in Figure 2. *Left Behind* explicitly sets out to narrate events from the Book of Revelation and in doing so frequently portrays God as a core actor. In contrast, most books invoke God’s intervention more sparingly. Notably, the novel featuring acts of God with the second-highest frequency (*Unashamed* by Francine Rivers) is not from the *Left Behind* series but is a retelling of the story of Rahab from the Bible. We would expect books explicitly retelling stories from the Bible to feature more acts of God; their high ranking by our classifier therefore reinforces our confidence in its accuracy.

7 Characterizing Acts of God

We find that the overwhelming majority of divine acts in our corpus are loving acts that affect individuals; this trend is notable even taking into account that our classifiers tend to over-predict these labels. Of all the acts of God identified in our corpus, 86.8% are labeled as affecting individuals and 13.2% affect groups. 79.4% of divine acts are classified as loving, 16.1% as both loving and punishing, 3.6% as punishing, and 0.9% as neutral. Although the majority of acts directed at both individuals and groups are loving, a far greater proportion of acts impacting groups are punishing in nature (6.25% vs. 3.22%) or both loving and punishing (29.17% vs. 14.16%). This reveals a difference in how God’s actions are characterized depending on who is affected.

The frequency of divine acts impacting individuals is negatively correlated with Apocalyptic Faith (Pearson’s R: -0.65, $p < 10^{-10}$), which is intuitive given apocalyptic acts often affect groups. A negative correlation also exists with Glorifying God (Pearson’s R: -0.58, $p < 10^{-7}$), which is surprising since this topic closely aligns with conventional Evangelical individualistic expressions of faith. There is also some connection between the characterization of divine acts and faith. The frequency of loving acts is negatively correlated with Apocalyptic Faith (Pearson’s R: -0.67, $p < 10^{-11}$) and Glorifying God (Pearson’s R: -0.58, $p < 10^{-7}$) and the frequency of acts that are both

¹⁷ All t-tests for difference in means are again performed with `sklearn` with Bonferroni correction with `statsmodels`.

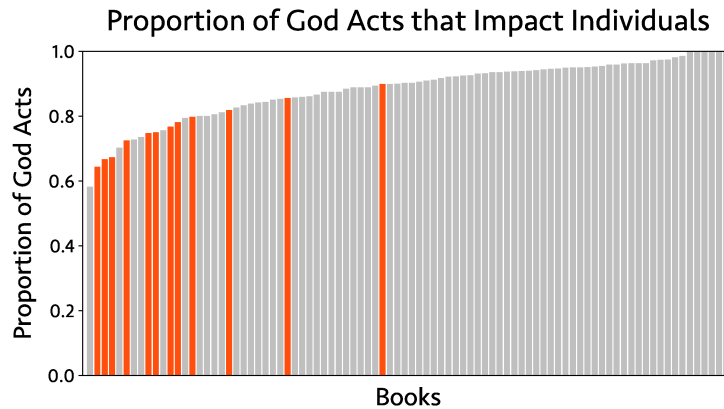


Figure 4: The proportion of passages labeled as containing acts of God that impact individuals. The *Left Behind* novels, shown in orange, have some of the lowest proportions of divine acts affecting individuals.

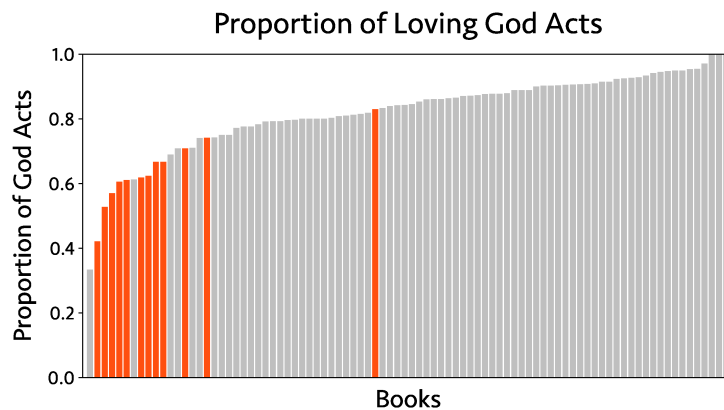


Figure 5: The proportion of passages labeled as containing acts of God that labeled as loving. The *Left Behind* novels, shown in orange, have some of the lowest proportions of loving divine acts.

loving and punishing is positively correlated with both these topics ($0.72, p < 10^{-13}$ — $0.65, p < 10^{-10}$). Combined, these trends demonstrate that apocalyptic themes and the glorification of God are associated with a greater frequency of punishing divine acts and acts of God which impact groups.¹⁸

We again find that the *Left Behind* novels are unique within our corpus. On average, a significantly smaller proportion of divine acts in these books are targeted towards individuals (76.03% vs. 90.11% , $p < 10^{-7}$, Figure 4), likely because they depict how God transforms the world in preparation for His Second Coming. We also see that a significantly smaller proportion of God's actions in the *Left Behind* books are depicted as loving (63.24% vs. 84.94% , $p < 10^{-10}$, Figure 5), while a significantly larger proportion of acts are both loving and punishing (28.73% vs. 11.31% , $p < 10^{-11}$). Moreover, nearly twice the proportion of actions are punishing on average (7.00% vs. 2.81% , $p < 0.05$). These differences reinforce that the apocalyptic narrative of the *Left Behind* series is not typical of Christian Fiction as a genre and the books should not be used as a proxy for the genre as a whole. Finally, we find no significant evidence that male and female authors differ in the frequency with which they portray acts of God or how they characterize these acts.

¹⁸ Correlations largely do not hold without *Left Behind* books, largely due to the small number of group and punishing acts that appear outside of them.

8 Conclusion

Our multidisciplinary work provides a combination of literary, cultural, and methodological insights. Scholarship has paid little attention to Christian Fiction published after the conclusion of the *Left Behind* series, instead focusing on the male-dominated cultural movements seeking to assert Evangelical Christianity through cultural power. In contrast, the Christian Fiction community has adopted a fundamentally different approach: one where Christian women, organized around faith and fiction, seek to transform the individual hearts and minds of Americans. This work begins the project of describing God’s portrayal in Christian Fiction, and thereby adds to our understanding of Evangelical ministry and faith. Ultimately, we find that the *Left Behind* series fundamentally differs from predominant Christian Fiction novels due to its depiction of a more active and punishing God while the authors who dominate Christian Fiction circles today largely write stories that model Evangelical femininity and depict a loving God.

From a methodological perspective, while it may be tempting — or terrifying — to think of new computational technologies as replacing scholarship with mere button pushing, we find that effectively using these methods requires an extensive, iterative process. More established methods such as topic modeling produce results of a clearly limited and general character that both facilitate and require interpretation. Newer prompt-based methods that both interpret text and produce human-readable outputs still require serious work before we understand what we want to ask of them and how we want to ask for it. Additionally, smaller LMs that are computationally accessible still struggle to annotate highly subtle phenomena with extremely high precision. However, combining the expertise of subject-matter experts and traditional qualitative research methods with contemporary LMs allows for us to begin to study these complex topics on previously unreachable scales, opening possibilities for many new avenues of research.

Acknowledgements

We would like to thank Erin Boell, Carolyn Chui, Estefania DeJesus, Alexandra Gier, Georgia Lawrence, Sushmi Majumder, and Elina Natarajan for their substantial annotation contributions. In addition, we thank Axel Bax, Federica Bologna, Anna Choi, Sil Hamilton, Kiara Liu, Landon Schnabel, Rosamond Thalken, Andrea Wang, Matthew Wilkens, and Shengqi Zhu for their thoughtful feedback. This work was supported in part by the NEH project AI for Humanists and the Society for the Scientific Study of Religion (SSSR) 2025 Student Research Grant.

References

- [1] Anglin, Kylie L, Bertrand, Ariell, Gottlieb, Jessica, and Elefante, Joseph. “Scaling Up With Integrity: Valid and Efficient Narrative Policy Framework Analyses Using Large Language Models”. In: *Policy Studies Journal* (2025). DOI: 10.1111/psj.70045.
- [2] Ashton, Cat. “The Young Person’s Guide to the Apocalypse: Left Behind for Kids”. In: *The Journal of Religion and Popular Culture* 31, no. 2 (2019), pp. 115–126. DOI: 10.3138/jrpc.2017-0045.
- [3] Barr, Beth Allison. *The Making of Biblical Womanhood: How the Subjugation of Women became Gospel Truth*. Grand Rapids, MI, USA: Baker Books, 2021.
- [4] Barrett, Rebecca Kaye. “Higher Love: What Women Gain from Christian Romance Novels”. In: *Journal of Religion and Popular Culture* 4, no. 1 (2003), pp. 1–9. DOI: <https://doi.org/10.3138/jrpc.4.1.001>.
- [5] Blei, David M., Ng, Andrew Y., and Jordan, Michael I. “Latent Dirichlet Allocation”. In: *Journal of Machine Learning Research* 3 (2003), pp. 993–1022.

- [6] Braunstein, Ruth. *Prophets and Patriots: Faith in Democracy across the Political Divide*. Oakland, CA, USA: University of California Press, 2017. DOI: 10.1525/california/9780520293649.001.0001.
- [7] Brei, Anneliese, Henry, Katharine, Sharma, Abhishek, Srivastava, Shashank, and Chaturvedi, Snigdha. “Classifying Unreliable Narrators with Large Language Models”. In: *Proceedings of the 63rd Annual Meeting of the Association for Computational Linguistics (Volume 1: Long Papers)*. Vienna, Austria, 2025, pp. 20766–20791. DOI: 10.18653/v1/2025.acl-long.1013. URL: <https://aclanthology.org/2025.acl-long.1013/>.
- [8] Butler, Anthea. *White Evangelical Racism: The Politics of Morality in America*. Chapel Hill, NC, USA: UNC Press Books, 2021.
- [9] Chapman, Jennie. “Tender Warriors: Muscular Christians, Promise Keepers, and the Crisis of Masculinity in Left Behind”. In: *The Journal of Religion and Popular Culture* 21, no. 3 (2009), pp. 1–13. DOI: 10.3138/jrpc.21.3.006.
- [10] Cordero, Jonathan. “The Production of Christian Fiction”. In: *Journal of Religion and Popular Culture* 6, no. 1 (2004), pp. 1–14. DOI: <https://doi.org/10.3138/jrpc.6.1.001>.
- [11] Deng, Yihe, Zhang, Weitong, Chen, Zixiang, and Gu, Quanquan. “Rephrase and Respond: Let Large Language Models Ask Better Questions for Themselves”. CoRR. 2023. DOI: 10.48550/arXiv.2311.04205.
- [12] Dittmer, Jason. “The Geographical Pivot of (the End of) History: Evangelical Geopolitical Imaginations and Audience Interpretation of Left Behind”. In: *Political Geography* 27, no. 3 (2008), pp. 280–300. DOI: 10.1016/j.polgeo.2007.12.002.
- [13] Domonoske, Camila. “Tim LaHaye, Evangelical Legend Behind ‘Left Behind’ Series, Dies at 90”. In: *National Public Radio: The Two-Way* (2016).
- [14] Douglas, Christopher. “Silence: Kidnapping, Abuse, and Murder in Early-Twenty-First-Century White Evangelical Fiction”. In: *Literature and Religious Experience: Beyond Belief and Unbelief*. London, UK: Bloomsbury Academic, 2022, pp. 177–192. DOI: 10.5040/9781350248984.ch-010.
- [15] Du Mez, Kristin Kobes. *Jesus and John Wayne: How White Evangelicals Corrupted a Faith and Fractured a Nation*. New York, NY, USA: Liveright Publishing, 2020.
- [16] Fernando, Chrisantha, Banarse, Dylan, Michalewski, Henryk, Osindero, Simon, and Rocktäschel, Tim. “Promptbreeder: Self-Referential Self-Improvement Via Prompt Evolution”. In: *Proceedings of the 41st International Conference on Machine Learning (ICML 2024)*. Vienna, Austria, 2024, pp. 13481–13544. DOI: 10.48550/arXiv.2309.16797.
- [17] Fitzgerald, Frances. *The Evangelicals: The Struggle to Shape America*. New York, NY, USA, 2017.
- [18] Frykholm, Amy Johnson. *Rapture Culture: Left Behind in Evangelical America*. Oxford, UK: Oxford University Press, 2004. DOI: 10.1111/j.0022-3840.2005.00157.x.
- [19] Gonzalez, Lucas, Shivanna, Rakesh, and Gemma Team, the. “Introducing Gemma 3n: Powerful, Efficient, Mobile-First AI”. Model Release. Mountain View, CA, USA: Google DeepMind, 2025.
- [20] Gorski, Philip S. *American Babylon: Christianity and Democracy Before and After Trump*. London, UK: Routledge, 2020.
- [21] Gorski, Philip S and Perry, Samuel L. *The Flag and the Cross: White Christian Nationalism and the Threat to American Democracy*. New York, NY, USA: Oxford University Press, 2022.

- [22] Gribben, Crawford. “Rapture Fictions and the Changing Evangelical Condition”. In: *Literature and Theology* 18, no. 1 (2004), pp. 77–94.
- [23] Gutjahr, Paul C. “No Longer Left Behind: Amazon.com, Reader Response, and the Changing Fortunes of the Christian Novel in America”. In: *Book History* 5, no. 1 (2002), pp. 209–236. DOI: 10.1353/bh.2002.0009.
- [24] Hicke, Rebecca MM, Bizzoni, Yuri, Feldkamp, Pascale, and Kristensen-McLachlan, Ross Deans. “Says Who? Effective Zero-Shot Annotation of Focalization”. In: *Proceedings of the 27th International Conference on Computational Linguistics*. Esch-Belval Esch-sur-Alzette, Luxembourg, 2025. DOI: 10.48550/arXiv.2409.11390.
- [25] Honovich, Or, Shaham, Uri, Bowman, Samuel R, and Levy, Omer. “Instruction Induction: From Few Examples to Natural Language Task Descriptions”. In: *The 61st Annual Meeting Of The Association for Computational Linguistics*. Toronto, Canada, 2023. DOI: 10.18653/v1/2023.acl-long.108.
- [26] Jaipersaud, Brandon, Zhu, Zining, Rudzicz, Frank, and Creager, Elliot. “Show, Don’t Tell: Uncovering Implicit Character Portrayal using LLMs”. In: *Proceedings of the Workshop on Generative AI and Creativity*. Vancouver, Canada, 2024. DOI: 10.48550/arXiv.2412.04576.
- [27] Jang, Woori and Jung, Seohyon. “Evaluating LLM Performance in Character Analysis: A Study of Artificial Beings in Recent Korean Science Fiction”. In: *Proceedings of the 4th International Conference on Natural Language Processing for Digital Humanities*. Miami, FL, USA, 2024, pp. 339–351. DOI: 10.18653/v1/2024.nlp4dh-1.34.
- [28] Jenner, Sarah, Raidos, Dimitris, Anderson, Emma, Fleetwood, Stella, Ainsworth, Ben, Fox, Kerry, Kreppner, Jana, and Barker, Mary. “Using large language models for narrative analysis: a novel application of generative AI”. In: *Methods in Psychology* 12 (2025), p. 100183. DOI: 10.1016/j.metip.2025.100183.
- [29] Kampen, Leo, Villarreal, Carlos Rabat, Yu, Louis, Karmaker, Santu, and Feng, Dongji. “LLM for Comparative Narrative Analysis”. 2025. DOI: 10.48550/arXiv.2504.08211. arXiv: 2504.08211 [cs.CL].
- [30] Krippendorff, Klaus. “Estimating the Reliability, Systematic Error and Random Error of Interval Data”. In: *Educational and Psychological Measurement* 30, no. 1 (1970), pp. 61–70. DOI: 10.1177/001316447003000105.
- [31] Laato, Joonatan, Kanerva, Jenna, Loehr, John, Lummaa, Virpi, and Ginter, Filip. “Extracting Social Connections from Finnish Karelian Refugee Interviews Using LLMs”. In: *Proceedings of the 5th Computational Humanities Research Conference (CHR 2024)*. 2024, pp. 662–680. DOI: 10.48550/arXiv.2502.13566.
- [32] Lampert-Weissig, Lisa. “Left Behind, the Holocaust, and that Old Time Antisemitism”. In: *Journal of Popular Culture* 45, no. 3 (2012), pp. 497–515. DOI: 10.1111/j.1540-5931.2012.00941.x.
- [33] Lieven, Anatol. *America Right or Wrong: An Anatomy of American Nationalism*. Oxford, UK: Oxford University Press, 2012.
- [34] McAlister, Melani. “Prophecy, Politics, and the Popular: The Left Behind Series and Christian Fundamentalism’s New World Order”. In: *The South Atlantic Quarterly* 102, no. 4 (2003), pp. 773–798. DOI: 10.1215/00382876-102-4-773.
- [35] McCallum, Andrew Kachites. “MALLET: A Machine Learning for Language Toolkit”. <http://mallet.cs.umass.edu>. 2002.

- [36] Michel, Gaspard, Epure, Elena V, Hennequin, Romain, and Cerisara, Christophe. “Evaluating LLMs for Quotation Attribution in Literary Texts: A Case Study of LLaMa3”. In: *Proceedings of the 2025 Conference of the Nations of the Americas Chapter of the Association for Computational Linguistics: Human Language Technologies (Volume 2: Short Papers)*. 2025, pp. 742–755. DOI: 10.18653/v1/2025.naacl-short.62.
- [37] Napierala, Paulina. “The Strategy of the Religious Right: Christian Fiction or Political Agitation?” In: *Ad Americam*, no. 13 (2012), pp. 45–65.
- [38] Neal, Lynn S. *Romancing God: Evangelical Women and Inspirational Fiction*. Chapel Hill, NC, USA: University of North Carolina Press, 2006.
- [39] OpenAI. “GPT-4o (Omni): A Multimodal Foundation Model”. Model Release. San Francisco, CA, USA: OpenAI, 2024.
- [40] Paradis, Kenneth. “Typological Realism in Contemporary Evangelical Fiction: Tragedy, Eternity, and The Shack”. In: *English Studies in Canada* 37, no. 1 (2011), pp. 107–133. DOI: 10.1353/esc.2011.0010.
- [41] Paragini, Margherita and Kestemont, Mike. “The Roots of Doubt: Fine-tuning a BERT Model to Explore a Stylistic Phenomenon”. In: *Proceedings of the Computational Humanities Research Conference (CHR 2022)*. Antwerp, Belgium, 2022, pp. 72–91.
- [42] Sancheti, Abhilasha and Rudinger, Rachel. “Tracking Evolving Relationship Between Characters in Books in the Era of Large Language Models”. In: *Proceedings of the The 7th Workshop on Narrative Understanding*. Albuquerque, New Mexico, 2025, pp. 64–82. DOI: 10.18653/v1/2025.wnu-1.12.
- [43] Shen, Jocelyn, Mire, Joel, Park, Hae, Breazeal, Cynthia, and Sap, Maarten. “HEART-felt Narratives: Tracing Empathy and Narrative Style in Personal Stories with LLMs”. In: *Proceedings of the 2024 Conference on Empirical Methods in Natural Language Processing*. Miami, FL, USA, 2024, pp. 1026–1046. DOI: 10.18653/v1/2024.emnlp-main.59.
- [44] Silliman, Daniel. *Reading Evangelicals: How Christian Fiction Shaped a Culture and a Faith*. Grand Rapids, MI, USA: William B. Eerdmans Publishing Company, 2021.
- [45] Smith, Christian. *American Evangelicalism: Embattled and Thriving*. Chicago, IL, USA: University of Chicago Press, 1998.
- [46] Subbiah, Melanie, Zhang, Sean, Chilton, Lydia B., and McKeown, Kathleen. “Reading Subtext: Evaluating Large Language Models on Short Story Summarization with Writers”. In: *Transactions of the Association for Computational Linguistics*. Cambridge, MA, 2024, pp. 1290–1310. DOI: 10.1162/tacl_a_00702.
- [47] Sunny, Amal, Gupta, Advay, Chandak, Yashashree, and Sreekumar, Vishnu. “From Stories to Statistics: Methodological Biases in LLM-Based Narrative Flow Quantification”. In: *Proceedings of the 29th Conference on Computational Natural Language Learning*. Vienna, Austria, 2025, pp. 201–215. DOI: 10.18653/v1/2025.conll-1.14.
- [48] Swirski, Peter. ““To Sacrifice One’s Intellect Is More Demonic than Divine”: American Literature and Politics in Left Behind: A Novel of the Earth’s Last Days”. In: *European Journal of American studies* 9, no. 2 (2014). DOI: 10.4000/ejas.10342.
- [49] Thompson, Laure and Mimno, David. “Authorless Topic Models: Biasing Models Away from Known Structure”. In: *Proceedings of the 27th International Conference on Computational Linguistics*. Santa Fe, New Mexico, USA, 2018, pp. 3903–3914.

- [50] Wang, Yizhong, Kordi, Yeganeh, Mishra, Swaroop, Liu, Alisa, Smith, Noah A, Khashabi, Daniel, and Hajishirzi, Hannaneh. “Self-Instruct: Aligning Language Models with Self-Generated Instructions”. In: *Proceedings of the 61st Annual Meeting of the Association for Computational Linguistics (Volume 1: Long Papers)*. Toronto, Canada, 2023, pp. 13484–13508. DOI: 10.18653/v1/2023.acl-long.754.
- [51] Whitehead, Andrew L and Perry, Samuel L. *Taking America Back for God: Christian Nationalism in the United States*. New York, NY, USA: Oxford University Press, 2020.
- [52] Wong, Janelle S. *Immigrants, Evangelicals, and Politics in an Era of Demographic Change*. New York, NY, USA: Russell Sage Foundation, 2018.
- [53] Ye, Qinyuan, Ahmed, Mohamed, Pryzant, Reid, and Khani, Fereshte. “Prompt Engineering a Prompt Engineer”. In: *Findings of the Association for Computational Linguistics (ACL 2024)*. Bangkok, Thailand, 2024, pp. 355–385. DOI: 10.18653/v1/2024.findings-acl.21.
- [54] Yuan, Xinfeng, Yuan, Siyu, Cui, Yuhan, Lin, Tianhe, Wang, Xintao, Xu, Rui, Chen, Jiangjie, and Yang, Deqing. “Evaluating Character Understanding of Large Language Models via Character Profiling from Fictional Works”. In: *Proceedings of the 2024 Conference on Empirical Methods in Natural Language Processing*. Miami, Florida, USA, 2024, pp. 8015–8036. DOI: 10.18653/v1/2024.emnlp-main.456.
- [55] Zhou, Yongchao, Muresanu, Andrei Ioan, Han, Ziwen, Paster, Keiran, Pitis, Silviu, Chan, Harris, and Ba, Jimmy. “Large Language Models are Human-Level Prompt Engineers”. In: *The Eleventh International Conference on Learning Representations*. Honolulu, HI, USA, 2023. DOI: 10.48550/arXiv.2211.01910.

A Corpus Information

A.1 Book List

Table 3: The full subcorpus of Christian Fiction texts analyzed.

Title	Author	Gender	Publisher	Year	Award	Status	Award Year
Arena	Karen Hancock	Female	Bethany House Publishers	2002	Allegory / Fantasy	Winner	2003
Dark Horse	John Fischer	Male	Revell / Baker Publishing Group	1983	Allegory / Fantasy	Finalist	2004
True to You	Becky Wade	Female	Bethany House Publishers	2017	Book of the Year & Contemporary Romance	Winner	2018
The Edge of Belonging	Amanda Cox	Female	Revell / Baker Publishing Group	2020	Book of the Year & First Novel	Winner	2021
Whose Waves These Are	Amanda Dykes	Female	Bethany House Publishers	2019	Book of the Year & First Novel & General Fiction	Winner / Finalist / Winner	2020
Burning Sky	Lori Benton	Female	WaterBrook Multnomah Publishing Group	2013	Book of the Year & First Novel & Historical	Winner	2014
Long Way Gone	Charles Martin	Male	Thomas Nelson	2016	Book of the Year & General Fiction	Finalist / Winner	2017
Within These Walls of Sorrow	Amanda Barratt	Female	Kregel Publications	2023	Book of the Year & Historical	Winner	2023
Becoming Mrs. Lewis	Patti Callahan	Female	Thomas Nelson	2018	Book of the Year & Historical Romance	Winner	2019

Title	Author	Gender	Publisher	Year	Award	Status	Award Year
Thief of Glory	Sigmund Brouwer	Male	WaterBrook Multnomah Publishing Group	2014	Book of the Year & Historical Romance	Winner	2015
The Five Times I Met Myself	James L. Rubart	Male	Thomas Nelson	2015	Book of the Year & Visionary	Winner	2016
A Garden to Keep	Jamie Langston Turner	Female	Bethany House Publishers	2001	Contemporary	Winner	2002
Bookends	Liz Curtis Higgs	Female	WaterBrook Multnomah Publishing Group	2000	Contemporary	Finalist	2001
Borders of the Heart	Chris Fabry	Male	Tyndale House Publishers	2012	Contemporary	Finalist	2013
Embrace Me	Lisa Samson	Female	Thomas Nelson	2007	Contemporary	Finalist	2009
Finding Alice	Melody Carlson	Female	WaterBrook Multnomah Publishing Group	2003	Contemporary	Finalist	2004
In High Places	Tom Morrissey	Male	Bethany House Publishers	2007	Contemporary	Finalist	2008
No Dark Valley	Jamie Langston Turner	Female	Bethany House Publishers	2004	Contemporary	Finalist	2005
Not a Sparrow Falls	Linda Nichols	Female	Bethany House Publishers	2002	Contemporary	Finalist	2003
Quaker Summer	Lisa Samson	Female	Thomas Nelson	2007	Contemporary	Finalist	2008
Straight Up	Lisa Samson	Female	WaterBrook Multnomah Publishing Group	2006	Contemporary	Finalist	2007
The Air We Breathe	Christa Parrish	Female	Bethany House Publishers	2012	Contemporary	Finalist	2013
The Living End	Lisa Samson	Female	WaterBrook Multnomah Publishing Group	2003	Contemporary	Finalist	2004
Winter Birds	Jamie Langston Turner	Female	Bethany House Publishers	2006	Contemporary	Winner	2007
All That It Takes	Nicole Deese	Female	Bethany House Publishers	2022	Contemporary Romance	Finalist	2023
All That Really Matters	Nicole Deese	Female	Bethany House Publishers	2021	Contemporary Romance	Winner	2022
How Sweet It Is	Alice J. Wisler	Female	Bethany House Publishers	2009	Contemporary Romance	Finalist	2010
Larkspur Cove	Lisa Wingate	Female	Bethany House Publishers	2010	Contemporary Romance	Finalist	2012
My Foolish Heart	Susan May Warren	Female	Tyndale House Publishers	2011	Contemporary Romance	Finalist	2012
Remembered	Tamera Alexander	Female	Bethany House Publishers	2007	Contemporary Romance	Winner	2008
Sworn to Protect	DiAnn Mills	Female	Tyndale House Publishers	2010	Contemporary Romance	Winner	2011
The Healer	Dee Henderson	Female	WaterBrook Multnomah Publishing Group	2002	Contemporary Romance	Finalist	2003
The Measure of a Lady	DeeAnne Gist	Female	Bethany House Publishers	2006	Contemporary Romance	Winner	2007
True Devotion	Dee Henderson	Female	WaterBrook Multnomah Publishing Group	2008	Contemporary Romance	Finalist	2001
Dangerous Passage	Lisa Harris	Female	Revell / Baker Publishing Group	2013	Contemporary Romance & Suspense	Winner	2014
Summer Snow	Nicole Baart	Female	Tyndale House Publishers	2008	Contemporary Series	Finalist	2009
The Waiting	Suzanne Woods Fisher	Female	Revell / Baker Publishing Group	2010	Contemporary Series	Finalist	2011
You Don't Know Me	Susan May Warren	Female	Tyndale House Publishers	2012	Contemporary Series	Winner	2013
Freedom's Ring	Heidi Chiavaroli	Female	Tyndale House Publishers	2017	First Novel	Finalist	2018

Title	Author	Gender	Publisher	Year	Award	Status	Award Year
Irish Meadows	Susan Anne Mason	Female	Bethany House Publishers	2015	First Novel	Finalist	2016
Roots of Wood and Stone	Amanda Wen	Female	Kregel Publications	2021	First Novel	Finalist	2021
The Mending String	Cliff Coon	Male	Moody Publishers	2004	First Novel	Winner	2005
A Cast of Stones	Patrick W. Carr	Male	Bethany House Publishers	2013	First Novel & Visionary	Finalist	2014
Auralia's Colors	Jeffrey Overstreet	Male	WaterBrook Multnomah Publishing Group	2007	First Novel & Visionary	Finalist	2008
Apocalypse Dawn	Mel Odom	Female	Tyndale House Publishers	2003	Futuristic	Finalist	2004
Apollyon	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	1999	Futuristic	Finalist	2000
Armageddon	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	2003	Futuristic	Finalist	2004
Assassins	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	1999	Futuristic	Finalist	2000
Desecration	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	2001	Futuristic	Finalist	2002
Life After	Katie Ganshert	Female	WaterBrook Multnomah Publishing Group	2017	General Fiction	Winner	2018
The Secret Keepers of Old Depot Grocery	Amanda Cox	Female	Revell / Baker Publishing Group	2021	General Fiction	Winner	2022
All for a Story	Allison Pittman	Female	Tyndale House Publishers	2013	Historical	Finalist	2014
Fire by Night	Lynn Austin	Female	Bethany House Publishers	2003	Historical	Winner	2004
Madman	Tracy Groot	Female	Tyndale House Publishers	2006	Historical	Winner	2007
Memories of Glass	Melanie Dobson	Female	Tyndale House Publishers	2019	Historical	Finalist	2020
The Medallion	Cathy Gohlke	Female	Tyndale House Publishers	2019	Historical	Winner	2020
The Noble Fugitive	T. Davis Bunn & Isabella Bunn	Both	Bethany House Publishers	2005	Historical	Finalist	2006
The Swiss Courier	Tricia Gover & Mike Yorkey	Both	Revell / Baker Publishing Group	2009	Historical	Finalist	2010
The White Rose Resists	Amanda Barratt	Female	Kregel Publications	2020	Historical	Winner	2021
A Defense of Honor	Kristi Ann Hunter	Female	Bethany House Publishers	2018	Historical Romance	Finalist	2019
A Portrait of Loyalty	Roseanna M. White	Female	Bethany House Publishers	2020	Historical Romance	Winner	2021
Calico Canyon	Mary Connealy	Female	Barbour Publishing	2008	Historical Romance	Finalist	2009
The Rose and the Thistle	Laura Frantz	Female	Revell / Baker Publishing Group	2023	Historical Romance	Winner	2023
The Sound of Light	Sarah Sundin	Female	Revell / Baker Publishing Group	2023	Historical Romance	Finalist	2023
Unashamed	Francine Rivers	Female	Tyndale House Publishers	2000	International Historical	Winner	2001
By Reason of Insanity	Randy Singer	Male	Tyndale House Publishers	2008	Mystery / Suspense / Thriller	Finalist	2009
By Way of Deception	Amir Tsarfati & Steve Yohn	Male	Harvest House Publishers	2022	Mystery / Suspense / Thriller	Finalist	2023
Mind Games	Nancy Mehl	Female	Bethany House Publishers	2018	Mystery / Suspense / Thriller	Finalist	2019

Title	Author	Gender	Publisher	Year	Award	Status	Award Year
The Girl Behind the Red Rope	Ted Dekker & Rachelle Dekker	Both	Revell / Baker Publishing Group	2019	Mystery / Suspense / Thriller	Winner	2020
The Rook	Steven James	Male	Revell / Baker Publishing Group	2008	Mystery / Suspense / Thriller	Winner	2009
Candle in the Darkness	Lynn Austin	Female	Bethany House Publishers	2002	North American Historical	Winner	2003
The Meeting Place	Janette Oke & T. Davis Bunn	Both	Bethany House Publishers	1999	North American Historical	Winner	2000
Dark Intercept	Brian Andrews & Jeffrey Wilson	Male	Tyndale House Publishers	2021	Speculative	Finalist	2022
Dark Justice	Brandilyn Collins	Female	Broadman & Holman Publishers	2013	Suspense	Finalist	2014
The Last Plea Bargain	Randy Singer	Male	Tyndale House Publishers	2012	Suspense	Finalist	2013
Shadow Hand	Anne Elisabeth Stengl	Female	Bethany House Publishers	2014	Visionary	Finalist	2015
Valley of the Shadow	Tom Pawlik	Male	Tyndale House Publishers	2009	Visionary	Finalist	2010
The Long Trail Home	Stephen Bly	Male	Broadman & Holman Publishers	2001	Western	Winner	2002
Glorious Appearing	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	2004	NA	NA	NA
Left Behind	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	1995	NA	NA	NA
Nicolae	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	1997	NA	NA	NA
Soul Harvest	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	1998	NA	NA	NA
The Indwelling	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	2000	NA	NA	NA
The Mark	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	2000	NA	NA	NA
The Remnant	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	2002	NA	NA	NA
Tribulation Force	Tim LaHaye & Jerry B. Jenkins	Male	Tyndale House Publishers	1996	NA	NA	NA

A.2 Books by Award Category

Table 4: The number of books in our corpus in each Award Category.

Award Category	# Books
Contemporary	13
Contemporary Romance	12
Historical	10
Book of the Year	9
First Novel	9
Historical Romance	8
Mystery / Suspense / Thriller	5
Futuristic	5
Visionary	5
General Fiction	4
Suspense	3
Contemporary Series	3
Allegory / Fantasy	2
North American Historical	2
International Historical	1
Young Adult	1
Speculative	1
Western	1

A.3 Christy Award Categories by Author Gender

Table 5: The number of books honored in each award category in the entire Christy Award corpus and the percentage of honorees in that category written only by female authors.

Award Category	# Books	% Female Authors
Amplify Award	3	100.0
Lits	7	100.0
Contemporary Romance	79	98.73
Historical Romance	52	98.08
Short Form	27	92.59
Young Adult	54	85.19
Historical	67	85.07
Contemporary Series	33	84.85
Speculative	13	84.62
First Novel	75	76.0
North American Historical	12	75.0
Book of the Year	11	72.73
General Fiction	23	69.57
Contemporary	52	69.23
Suspense	35	57.14
Visionary	47	55.32
Allegory / Fantasy	6	50.0
Mystery / Suspense / Thriller	50	48.0
International Historical	12	41.67
Futuristic	15	13.33
Western	6	0.0

B Annotation Instructions and Prompts

B.1 *Act of God* Instructions for Human Annotators

Is God acting or is an act of God described? – Code: 1 = Yes, 2 = Maybe, 3 = No

1. Yes: In the passage something is clearly ascribed to God.
 - (a) NOTE: If there is an active Verb (including love), that's an Act that we trust unless there is **narrative uncertainty**.
 - (b) NOTE: If God is described as one who does an active verb (God who provided / the One who gives me marching orders) this is a Yes, as an action is occurring or has occurred.
 - (c) NOTE: Descriptions and Quotes from the Bible that describe acts are acts of God.
2. Maybe: Something is insinuated to be due to God, but it is left ambiguous.
 - (a) NOTE: The maybe category is designed for the natural coincidences (like the perfect sunsets), the narrative uncertainties (was that really God?), and mystical language that highly suggests that God is acting (something keeps her here).
 - (b) NOTE: In order for something to be ascribed to God (Yes), there must be **narrative certainty**. If the narrator or non-internally focalized text confirms or disputes the intervention being God's, we trust that. If a character says something that is not questioned, we trust that it is legitimate. If we see a character ascribe action to God that is questioned by other characters or the narration, we don't trust that God has acted. Ultimately, if the author introduces DOUBT about it being God, we DOUBT too. If there is no DOUBT in the passage that it is God's act, then we trust it.

(c) NOTE: If God is thanked in response to an action, it is implied the action might be attributed to God, so this is a Maybe.

3. No: No mention is made in the passage of an action by God.

(a) NOTE: Future tense (God will do...) is a NO. As are descriptors of God (God is kind / loving / powerful / righteous) and descriptors of individuals (God's chosen one / God's loved one).

B.2 Model Prompts for Characterizing Acts of God

Prompt: Who does God affect?

You will be given a description of an act of the Christian God in a novel passage. Decide who the Christian God is affecting in the passage.

Choose one of the following codes:

- INDIVIDUAL: God affects one person.
- GROUP: God affects a group or community (e.g., a church, a town, a book club).

Please respond with:

- god_affect_explanation: Explain why you chose INDIVIDUAL or GROUP
- god_affect: INDIVIDUAL or GROUP

```
<text>
[INSERT TEXT HERE]
</text>
```

Prompt: What is the intent of God's act?

You will be given a description of an act of the Christian God in a novel passage. Decide what kind of action it is.

Choose one of the following codes:

- LOVING: God's action is kind (for example it involves mercy, love, forgiveness, or help).
- PUNISHING: God's action is meant to punish or judge (for example it involves anger, vengeance, violence, or judgment).
- BOTH: God's action has elements of both love and punishment.
- NEUTRAL: God's action is neutral or ambiguous. Avoid using this label when possible.

Please respond with:

- god_impact_explanation: Explain why you chose LOVING, PUNISHING, BOTH, or NEUTRAL
- god_impact: LOVING, PUNISHING, BOTH, or NEUTRAL

```
<text>
[INSERT TEXT HERE]
</text>
```

C Topic Modeling Results

C.1 Topic Labels and Keywords

Table 6: Each of the 65 topics with human-annotated labels and the top 10 keywords.

Topic	Label	Words
0	Measuring Time	minutes, three, five, ten, four, six, later, hundred, twenty, watch
1	Kitchen + Dining	table, food, eat, kitchen, bread, plate, bowl, set, dinner, bite
2	Joyful Affection	love, heart, smile, eyes, kiss, loved, joy, beautiful, together, kissed
3	Goodbyes	won't, leave, you'll, stay, we'll, better, head, else, wouldn't, you've
4	Familial Relationships	family, father, children, mother, parents, son, daughter, child, brother, name
5	Reading + Writing	read, book, reading, story, books, words, page, writing, bible, write
6	Groups of People	men, women, others, each, line, three, group, camp, guards, guard
7	Digital Communication	phone, call, number, cell, voice, called, message, name, calling, rang
8	Familial Emotions + Hardships	mom, dad, mother, okay, father, she's, sorry, happened, love, kids
9	Body + Intimacy	eyes, air, voice, head, skin, body, chest, hand, open, arms
10	Young Adult Life	pretty, kind, she's, nice, girl, probably, lot, bad, guy, real
11	Financial Assets	money, pay, business, buy, job, store, dollars, house, paid, sell
12	Perception of Self + Others	eyes, face, seen, herself, seemed, such, smile, almost, caught, eye
13	Confessional Prayer	done, must, truth, myself, love, believe, father, understand, feel, god
14	Familial Events	father, mother, aunt, father's, daddy, mama, mother's, uncle, family, herself
15	Body Language	head, eyes, hand, shook, hands, leaned, face, chair, nodded, glanced
16	Sleeping	bed, night, sleep, morning, room, asleep, sleeping, hours, slept, awake
17	Urban Movement	street, building, walked, past, walk, walking, corner, guard, steps, crowd
18	Affectionate Gestures	smile, hand, miss, smiled, thank, gave, young, nodded, meet, please
19	Education	school, year, high, college, class, kids, during, teacher, ago, summer
20	State Conflict + WW2	men, war, soldiers, army, general, city, military, battle, news, german
21	Sky Appearance	light, its, dark, white, sky, black, sun, above, red, darkness
22	Nations + International Community	world, community, meeting, news, believe, each, states, united, everyone, become
23	Violence	head, blood, ground, feet, body, face, gun, arm, hands, dead
24	Stationary	paper, letter, read, letters, desk, envelope, written, note, write, name
25	Sports	game, play, ball, team, played, playing, games, win, second, field
26	Friendship	days, each, friends, friend, times, seemed, since, often, part, spent
27	Motherhood + Infancy	mrs, baby, child, mother, husband, girl, ma'am, young, women, she's
28	Rural Nature	trees, tree, house, its, grass, ground, woods, along, leaves, path
29	Formal Clothing	dress, wearing, white, shirt, black, shoes, wore, coat, clothes, blue
30	States of Being	someone, seemed, hadn't, finally, looking, else, waited, started, room, seen
31	Casual Conversation	okay, guy, head, guess, better, lot, pretty, you've, stuff, doing
32	Home	house, rachel, night, kitchen, dinner, table, morning, today, later, already
33	Doubtful + Unsure	hadn't, wouldn't, trying, everything, part, needed, myself, thinking, happened, else

Topic	Label	Words
34	Cleaning the Home	water, clean, clothes, kitchen, sink, hot, hands, bathroom, towel, wash
35	Violent Crime	death, dead, killed, kill, believe, prison, murder, story, tried, justice
36	House Features	room, floor, house, open, wall, window, table, kitchen, stairs, hall
37	Technology	computer, screen, video, name, information, show, camera, miles, second, list
38	Physical Features	hair, eyes, face, dark, brown, white, skin, black, tall, gray
39	Aircraft	plane, area, air, pilot, radio, fly, hours, ground, clear, phone
40	Youthful Playing	boy, boys, son, laughed, girl, laughing, laugh, laughter, name, mouth
41	Law Enforcement	police, case, officer, information, someone, agent, evidence, needed, involved, working
42	Photographs	box, bag, picture, ring, opened, open, small, set, photo, counter
43	Glorious God	god, lord, jesus, pray, bible, god's, love, faith, christ, prayer
44	Intimate Touch	hand, eyes, face, hands, tears, arm, head, held, pulled, reached
45	Physical Nervousness	eyes, voice, face, breath, throat, hands, chest, head, heart, mouth
46	Grief + Emotional Turmoil	heart, fear, world, words, lost, pain, voice, gone, death, eyes
47	Listening	says, looks, hand, she's, hands, head, takes, eyes, turns, comes
48	Apocalyptic Faith	god, shall, world, great, israel, crowd, earth, jerusalem, michael, power
49	Human Movement	feet, open, hand, foot, onto, under, pulled, steps, reached, top
50	Passage of Time	morning, night, days, hadn't, since, week, weeks, afternoon, three, they'd
51	Ocean + Shore	water, boat, river, lake, sea, bridge, shore, its, fish, cold
52	Horses	horse, wind, rain, horses, sky, far, its, ground, clouds, feet
53	Medical Pain	doctor, hospital, room, pain, blood, medical, nurse, body, leg, bed
54	Rural Towns + Travel	city, town, train, north, street, west, south, road, streets, river
55	Beverages + Drinking	coffee, cup, tea, drink, table, glass, water, bottle, set, sip
56	Communication	voice, words, hear, answer, question, spoke, speak, word, ask, understand
57	Motor Vehicles	car, road, seat, truck, pulled, drive, window, parking, drove, lot
58	Questioning	such, question, doubt, already, point, certain, between, fact, given, best
59	Royalty	king, upon, such, must, lord, great, men, speak, shall, far
60	Childhood Pets	girl, children, child, boy, dog, cat, name, small, eyes, sister
61	Fire	fire, smoke, wood, flames, burning, set, heat, air, burned, pieces
62	Holidays (Christmas)	christmas, red, white, gift, art, paint, color, flowers, beautiful, painting
63	Congregation Worship	church, music, song, pastor, sunday, singing, service, sing, dance, sang
64	Passage of Time	since, perhaps, days, leaving, such, certain, leave, window, its, evening

C.2 Topics Ranked by Prominence

Table 7: The topics ranked by average novel prominence.

Topic	Label	Average Novel Prominence
23	Violence	3.86
58	Questioning	3.48
33	Doubtful + Unsure	3.44
13	Confessional Prayer	3.28
31	Casual Conversation	3.24
45	Physical Nervousness	3.2
3	Goodbyes	2.96
44	Intimate Touch	2.42

Topic	Label	Average Novel Prominence
15	Body Language	2.42
46	Grief + Emotional Turmoil	2.25
18	Affectionate Gestures	2.21
30	States of Being	2.16
49	Human Movement	2.06
36	House Features	2.02
4	Familial Relationships	1.9
43	Glorious God	1.81
47	Listening	1.8
59	Royalty	1.75
52	Horses	1.7
26	Friendship	1.68
9	Body + Intimacy	1.64
28	Rural Nature	1.64
21	Sky Appearance	1.63
2	Joyful Affection	1.6
12	Perception of Self + Others	1.59
1	Kitchen + Dining	1.57
50	Passage of Time	1.55
22	Nations + International Community	1.53
39	Aircraft	1.51
0	Measuring Time	1.51
56	Communication	1.45
10	Young Adult Life	1.44
38	Physical Features	1.41
16	Sleeping	1.41
17	Urban Movement	1.35
7	Digital Communication	1.26
19	Education	1.25
57	Motor Vehicles	1.22
8	Familial Emotions + Hardships	1.22
20	State Conflict + WW2	1.19
41	Law Enforcement	1.18
29	Formal Clothing	1.17
11	Financial Assets	1.15
48	Apocalyptic Faith	1.09
6	Groups of People	1.07
35	Violent Crime	1.06
64	Passage of Time	1.01
32	Home	0.97
5	Reading + Writing	0.92
24	Stationary	0.86
54	Rural Towns + Travel	0.85
62	Holidays (Christmas)	0.85
37	Technology	0.83
51	Ocean + Shore	0.79
42	Photographs	0.78
61	Fire	0.75
60	Childhood Pets	0.72
63	Congregation Worship	0.72
34	Cleaning the Home	0.71
55	Beverages + Drinking	0.7
40	Youthful Playing	0.68
53	Medical Pain	0.66
25	Sports	0.64
14	Familial Events	0.62
27	Motherhood + Infancy	0.61