



Word Cloud Visualization of Media Reactions to USAID Shutdown

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ABSTRACT

The closure of USAID prompted various reactions by the media, which in turn affected public opinion and ongoing policies. This research investigates how media narratives cover the shutdown of USAID using word cloud visualization to capture themes and sentiments. The research attempts to find: What are the dominant media narratives regarding the shutdown? Using tokenization, stopword elimination, and frequency analysis before generating a word cloud to illustrate prominent words. The data shows that US media focuses on government spending, foreign aid, employment, and diplomatic activity, which all influence the public perception of the shutdown. The study argues that computational text analysis aids in the understanding of media discourse and sentiments on policies, which help policymakers and scholars concerned with public opinion and policy discourse on international aid and development issues. This study advances the field of media by expanding the scope of the study of visual politics and political communication. The analysis reveals that the conversation revolves around government activities, consequences of foreign aid, workforce considerations, and spatial politics, with "funding," "security," and "diplomatic" standing out the most. The analysis of the media coverage shows that the shutdown is framed as a political as well as an economic crisis, constructing a narrative that is later used in public discourse and policy discussions. This project adds to the body of work on media by employing visual analysis in the study of political communication and analyzing media framing from a computational perspective.

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INTRODUCTION

The suspension of operations at USAID, an agency of significant importance in international development and humanitarian aid, has garnered attention from various social media users, thus influencing public discussions and policy controversies. The theory of media framing claims that news agencies dictate how issues are understood and what actions are taken regarding them (Entman, 1993). In their research, Kim and Hovy (2003) provide evidence that media coverage is organized according to framing strategies, different frames affect how the public is perceived. The application of ANTMN across case studies such as U.S. Senate elections, international news coverage, and even contagious epidemics shows how these themes are captured and contextualized within the theory's framework, underscoring the method's efficiency in capturing thematic structures and relational framing compared to content analysis. However, there has been scant attention to the employment of word cloud to examine overwhelming mediatic discourses and provide a fresh perspective in identifying the prevailing narratives and emotions. This approach fills that void through a computation method that constructs and examines narratives of media coverage on the USAID shutdown, showing what public opinion and policy attention is issued. With the use of automated linguistics processing, this analysis demonstrates a new perspective in the field of media studies by using visuals to explain intricate socio-political phenomena.

The principal research problem tackled in this study is: In what ways do media stories influence public understanding of the USAID shutdown, and what are the predominant themes that appear in word cloud analysis?

The role of news framing in shaping societal responses and policy development has been at the core of media and public discourse analysis for decades. Framing is one of the concepts based on the elaboration of media coverage in issue attention cycles provided by Entman. Framing refers to the selection of certain aspects of reality and media telling people what to think about those aspects. The agenda-setting hypothesis was augmented by McCombs and Shaw when they noticed that the media emphasis on certain issues could shift the order of public interests (McCombs & Shaw, [1972](#)). There is also a growing body of literature in computational linguistics which has focused on bias and sentiment analysis in the coverage of news articles (Pang & Lee, [2008](#)). Recently, the progress of Natural Language Processing (NLP) has allowed researchers to analyze media data in bulk using text mining. Some scholars who study media discourse for a long time started to apply more sophisticated approaches like topic modeling and network analysis to look at the changes in media coverage over time (Blei, [2012](#); Lazer et al., [2018](#)). Visual techniques which include, among others, the word cloud analysis, have become popular because they provide simple means for analysis of large amounts of textual information (Heimerl et al., [2014](#)). The results also demonstrate how these media outlets are consistent with the use of specific phrases that influence public narratives on policies, showing variations based on political orientation, area of focus, and type of media used (Kim et al, [2003](#)).

This study provides new methodological insights into media studies and political communication using computational methods to examine the social media commentary elicited by the closing of USAID.

The effects of the closures of International Non-Governmental Organizations (INGOs) have been one of the most pressing issues for international relations development and usually concerns political, financial, and administrative aspects. Their funding base comes with severe limitations in the form of imposed government assistance, financial aid difficulties, and geopolitical strife (Edwards, [2014](#)). Essentially, more and more legally restrictive governments have used legal and administrative measures to limit the scope of operations of INGOs by claiming national sovereignty and violation (Dupuy et al., [2016](#)). It has now been established that the closure of International Non-Governmental Organizations (INGOs) results to humanitarian assistance bottlenecks in conflict zones, fragile states, and worsening local crises (Pallas & Sidel, [2020](#)). Due to reliance on foreign international sponsorship funding, these organizations are at risk of immediate cessation of activities due to political changes that are budgetary cuts or policy shifts (Cooley & Ron, [2002](#)). In addition, international non-governmental organizations are faced with increasing digital information surveillance and cybersecurity control which is more authoritarian and oppressive with more power threatening their operational and data privacy freedoms (Rubenstein, [2017](#)). With all these threats, there are negative impacts that international non-governmental organizations are able to manage through local partners and delegation of decision-making powers. Analyzing these shutdowns from political and economic lenses clarifies their greater impact on international development, human rights, and global governance.

This study focuses on how media narratives construct public understanding of the USAID shutdown and aims to identify predominant themes and sentiments using word cloud visualization. For this purpose, the study intends to address the following question: What is the role of word cloud visualization in depicting the public response and the policy debate regarding the shutdown? The primary aim of this study is to fill the existing gap in media discourse analysis by applying computational methods, particularly natural language processing and visual analytics, in the examination of massive media narratives. This study fills a gap in media studies, political communication, and computational social science by providing a practical example on the use of video footage, image, or text as data to analyze how the media shaping public opinion in relation to the significant changes to policies.

To resolve the research issue effectively, this article is divided into several sections. The Introduction examines existing media framing, sentiment analysis, and word cloud visualization theories and studies regarding political communication. The Methodology describes the techniques used to collect information, the computation processes, as well as the analysis and visualization of the media narratives regarding the USAID shutdown. The Result and Discussion provides the major themes and sentiments that emerged from the word cloud analysis while discussing differences among the media and their consequences for public opinion and policy discussion. The Conclusions outline the study's findings and contributions, explain gaps in the research, and recommend topics for further work, especially on broadening the use of computational techniques in the analysis of media discourse involving international political events to the rest of the world. The article aims to defend the claim that the USAID media portrayal represents a drastic lack of understanding of international relations and diplomacy. Because of this, the article attempts to analyze the discourse surrounding the cutoff in aid reporting through the lens of social constructivism. However, in doing so, the article proposes a new methodological approach to the study of media influence on political communication. It serves to examine the role of the mass media in the construction of the public image of a country and its policies towards foreign policy aims.

Numerous theoretical and computational analyses have been conducted on the relationship between media discourse, and public perception. Media framing is one of the concepts used to explain the way the media constructs public narratives. Entman (1993) contends that audiences interpret news in specified ways because framing affects specific aspects of an issue. McCombs and Shaw (1972) proposed agenda-setting theory and illustrated it with evidence that media influences what the public considers to be important by covering such issues. To Scheufele and Tewksbury (2007), these theories explicate the analysis of media depiction of political activities and policy issues.

In the past few years, the development of NLP techniques and other computer orientation techniques made it possible to analyze media on a much wider scale. Sentiment analysis has been applied to examine the degree of bias, emotional inclination, or polarization of the tone of news stories (Pang & Lee, 2008). Blei (2012) proposed new methods of topic modeling, such as LDA, marking a shift in the field on the study of thematic structures in large text collections. Lazer et al. (2018) argue that the contribution that computer science brings to social science has greater importance in spotting cases of misleading information and framing bias in the media.

In addition, word clouds are used for visualizing results and have become a powerful technique for dealing with text data. According to Heimerl et al. (2014), word clouds are particularly beneficial in analyzing unstructured text and are therefore helpful in media studies. Nonetheless, previous research has mostly concentrated on the sentiment analysis and the topic modeling of a discourse rather than the use of visualization tools for examining policy affairs.

Newer research reveals that Orange's Word Cloud visualization tool has been integrated in numerous studies. For example, Patil (2024) applied this feature for his analysis of the dataset on 'Generative Artificial Intelligence in Advertising' fetched from Wikipedia. The word cloud view helped comprehensively identify the insights and key words pertaining to the discussion on AI and Advertising. Likewise, Fitri, Muhammad, Riki, and Sampath (2023) employed Orange's Word Cloud feature in a study that scrutinized students' attitudes toward and contra attitudes to online and face-to-face learning in information technologies education courses. This improvement clearly illustrated the prevalent themes and sentiments within the students' feedback, thus allowing deeper understanding of the data. These examples emphasize the types of text data Orange's Word Cloud feature can analyze and the useful information that can be extracted.

Despite the existing literature on media responses to political policies, there is little work done using computer-generated ways of visually integrating and analyzing media coverage of significant geopolitical occurrences. This work fills this gap by analyzing media discourse on the USAID shutdown employing word cloud analysis and, thus, provides fresh methodology to political communication and media studies.

Media framing focuses on specific aspects of an issue while omitting others, thus shaping public perception (Entman, 1993). Sentiment analysis classifies media content based on emotional ascribed tone (Pang & Lee, 2008), while more recent topical modeling techniques such as Latent Dirichlet Allocation (Blei, 2012) expose hidden themes in a body of work. These approaches, however, attempt to capture prominence and framing methods in a discourse that sentiment analysis inherently reduces to a simplistic bipolar spectrum or topic modeling abstracts content at a level that does not make key terms vital to the discussion explicit (Lazer et al., 2018; Ali & Hassan, 2022). Heimerl et al. (2014) contend that word cloud visualizations aid in demonstrating the intuitive representation of the dominating narrative of a specific issue. In contrast to other techniques, word clouds can serve to identify the most used and discussed terms in media coverage, elucidating the prominence of these words (Ali & Hassan, 2022).

This study seeks to address this gap using techniques from natural language processing (NLP) to investigate the media discourse on the USAID shutdown to analyze the narrative constructed by different media outlets and the resulting implications of such policies and seeks to show how effective the word cloud visualization method helps reveal framing strategies, aiding policymakers and scholars understand the relevance of some terms in guiding public perception and understanding.

METHODOLOGY

This study using Orange's Word Cloud and has a data processing pipeline that includes several important steps that transform text into actionable information with the help of word cloud visualization. The process starts with data collection through primary and secondary sources. Primary sources include news articles, opinion pieces, and media reports related to the USAID shutdown, while secondary sources include media coverage that is archived online, as well as those collected through web scraping or API's from social media, news aggregators, and other online platforms. These text data sets are then subjected to tedious, and painstaking cleansing of the data to remove errors and ambiguities from the data.

Upon collection, the raw text data goes through preprocessing, whereby the text undergoes some refinement steps. The first step is tokenization, which is the separation of the text into specific phrases or words. This is particularly useful in disintegrating complex sentences with multiple clauses and phrases and is helpful in structuring the dataset for further analysis. After tokenization, frequently occurring words that do not offer value to the core discussion of the text, such as "the," and "is," are omitted (stopword removal). The next step is lemmatization and stemming, whereby words are diluted to their base form to make sure there is uniformity in word representation (e.g., "running" turns to "run," "governmental" turns to "government"). Stemming occurs through rule-based truncation, while lemmatization uses a dictionary to transform words. The latter, however, provides greater linguistic preservation.

This stage of the process updates and modifies elements of the data to make the analysis easier to interpret and work with. When removing unwanted parts of words such as punctuation, special characters, or numbers, this process is known as filtering. Another part of this stage is identifying and counting the most frequently used words in the data set, also known as frequency analysis. Some techniques that can be used to alter and analyze data is TF-IDF (term frequency-inverse document

frequency). This technique is used to analyze the importance of specific words in a document among other documents and minimizes the impact of words that are frequently used. Another technique that can be performed in this stage is analyzing the emotions associated with a specific word and categorizing it in a positive, negative, or neutral scope known as sentiment analysis.

The generation of the word cloud, which is the final step in the process, encapsulates the most common words and their occurrences visually. In the image, larger words form is more frequent, easing the interpretation of media discourse. This enables the viewer to grasp the central topics within a theme in a straightforward and quick manner, without needing advanced statistical knowledge. This NLP paradigm shift, along with computing visualization, changes the scope of analysis from traditional qualitative media studies to provide a new methodological approach to the study of political communication. The systematic approach guarantees that the research answers its main question: In what ways do media constructs affect public opinion towards the cessation of activities by USAID, and which themes emerge in the media narratives as indicated by a word cloud generated visualization? This framework is not only giving practical answers but also adds to the academic discourse on the impact of media and framing policy issues.

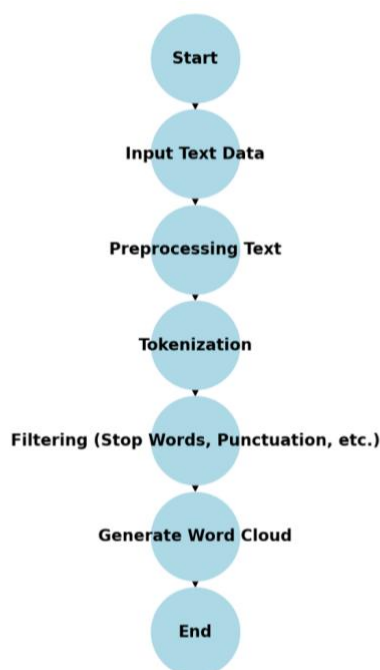


Figure 1. Text Processing Flowchart for Word Cloud Generation

The limitations of using a word cloud have to do with providing no context or relations between the words and controlled statistical modeling, while still providing an intuitive visual representation of patterns in media coverage. The method is appropriate here because, unlike other methods such as sentiment analysis and topic modeling, it does not attempt to box its interpretation into preconceived categories. Topic modeling, including LDA, requires cumbersome parameter tuning, heavily relies on probability assumptions, and often overshadows the specific terms used to describe framing. Sentiment analysis reduces text into uninformative positive, negative, or neutral labels. This research combines word clouds with frequency analysis and TF-IDF weighting to strengthen negation of context within the image produced by the word cloud so that key definitions are both elevated and quantitatively supported. Beyond advanced text analysis, this study aims to understand the media narrative around the U.S. aid shutdown as conveyed through the integration of data visualization and computation, grounding its findings in clear evidence.

RESULT AND DISCUSSION

In the distance matrix provided, all articles have their pairwise textual similarities analyzed, where smaller values represent greater similarity and larger values denote a greater difference. The diagonal values which are not filled out or faintly colored correspond to self-distances and these are always zero. The color gradient from dark to light signals the degree of similarity between articles, where lower distance means greater similarity, thus darker green indicates more similarity while a lighter green or white is greater textual differences. Articles like Article 17 and Article 16 (distance ~71.35) are notably similar, while Articles 10 and 5 (distance ~40.97) are more different. The distances calculated using methods based on Euclidean distances, which differentiate based on lexical or semantic relationships of the text vectors. This matrix is especially relevant when wanting to cluster similar articles and identifying redundant content to recommend related readings in automated text analysis systems. In combination with the discourse patterns in media, it will assist in topic modeling, text summarization, and content-based recommendation engines. This distance matrix serves a special purpose of clustering articles with high similarity, which aids in the automatic detection of duplicated documents and the generation of recommender systems for different articles. Combined with pattern recognition of the discourse in the media, this approach aids in the topic modeling, text summarization and content-based recommendation system.

	article 1	article 10	article 11	article 12	article 13	article 14	article 15	article 16	article 17	article 18	article 19	article 2	article 20	article 3	article 4	article 5	article 6	article 7	article 8	article 9
article 1		44,967	50,498	40,608	45,541	47,329	47,212	47,424	74,579	58,958	44,598	46,733	46,422	41,304	54,562	40,976	54,176	46,957	44,204	46,141
article 10	44,967		48,518	34,132	38,652	38,053	43,046	36,865	64,452	54,809	36,701	33,106	36,837	37,229	53,038	30,578	46,119	38,897	38,000	43,920
article 11	50,498	48,518		48,611	50,951	52,915	50,882	54,507	73,553	60,729	51,604	51,166	51,546	50,418	56,789	49,244	58,660	51,157	49,437	47,760
article 12	40,608	34,132	48,611		31,321	34,511	37,630	33,226	70,873	53,301	31,969	34,015	33,853	30,578	51,245	27,749	43,658	37,947	33,272	38,262
article 13	45,541	38,652	50,951	31,321		36,770	41,629	38,588	68,644	49,619	34,511	38,807	37,216	34,293	52,678	34,103	45,596	41,605	40,100	42,202
article 14	47,329	38,053	52,915	34,511	36,770		43,898	42,462	66,558	52,038	41,243	39,825	40,706	36,414	51,254	36,208	41,773	40,037	40,150	46,508
article 15	47,212	43,046	50,882	37,630	41,629	43,898		45,122	73,342	58,694	42,638	45,022	43,749	40,435	56,921	40,447	50,675	44,565	42,860	43,428
article 16	47,424	36,865	54,507	33,226	38,588	42,462	45,122		71,351	57,332	34,900	35,930	35,693	39,256	57,236	33,045	48,600	43,497	40,311	47,308
article 17	74,579	64,452	73,553	70,873	68,644	66,558	73,342	71,351		65,085	70,292	69,871	66,038	69,210	72,284	71,533	62,825	56,613	75,881	78,083
article 18	58,958	54,809	60,729	53,301	49,619	52,038	58,694	57,332	65,085		56,027	57,689	52,887	53,292	64,475	55,344	54,305	51,624	60,663	60,407
article 19	44,598	36,701	51,604	31,969	34,511	41,243	42,638	34,900	70,292	56,027		37,696	34,699	37,483	53,198	31,623	46,883	40,939	37,376	43,035
article 2	46,733	33,106	51,166	34,015	38,807	39,825	45,022	35,930	69,871	57,689	37,696		36,892	39,547	56,347	22,650	49,325	43,186	37,443	46,573
article 20	46,422	36,837	51,546	33,853	37,216	40,706	43,749	35,693	66,038	52,887	34,699	36,892		38,510	54,863	34,117	47,223	41,012	40,951	43,243
article 3	41,304	37,229	50,418	30,578	34,293	36,414	40,435	39,256	69,210	53,292	37,483	39,547	38,510		51,740	34,044	44,418	37,961	38,471	40,755
article 4	54,562	53,038	56,789	51,245	52,678	51,254	56,921	57,236	72,284	64,475	53,198	56,347	54,863	51,740		53,404	55,335	52,745	53,582	53,535
article 5	40,976	30,578	49,244	27,749	34,103	36,208	40,447	33,045	71,533	55,344	31,623	22,650	34,117	34,044	53,404		47,560	40,175	31,828	41,569
article 6	54,176	46,119	58,660	43,658	45,596	41,773	50,675	48,600	62,825	54,305	46,883	49,325	47,223	44,418	55,335	47,560		41,617	50,329	53,647
article 7	46,957	38,897	51,157	37,947	41,605	40,037	44,565	43,497	56,613	51,624	40,939	43,186	41,012	37,961	52,745	40,175	41,617		44,373	47,202
article 8	44,204	38,000	49,437	33,272	40,100	40,150	42,860	40,311	75,881	60,663	37,376	37,443	40,951	38,471	53,582	31,828	50,329	44,373		42,837
article 9	46,141	43,920	47,760	38,262	42,202	46,508	43,428	47,308	78,083	60,407	43,035	46,573	43,243	40,755	53,535	41,569	53,647	47,202	42,837	

Figure 2. Distance Matrix Result

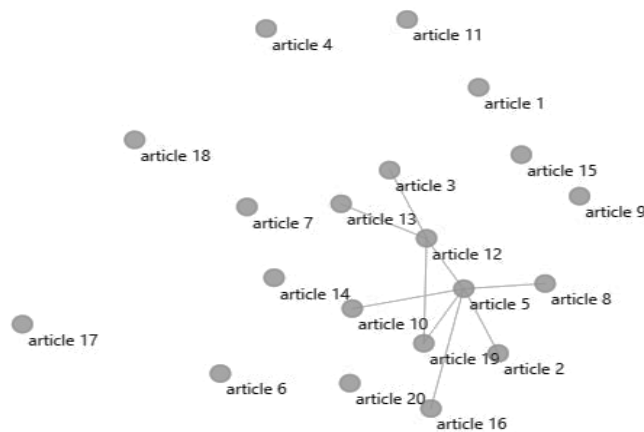


Figure 3. Multi-Dimensional Scaling (MDS) Result

blockages. These words, “security,” “budget,” “spending” are illustrative of the affording and the politics that crafted the story of the shutdown.

Even political leaders and organizations were covered in the press, as evidenced by the terms 'president,' 'congress,' 'rubio,' and 'officials.' These phrases also suggest political decision making and legislative action. Furthermore, “Russia,” “China,” and “Washington” suggest that other countries and U.S. foreign policy issues were reported on as well. Furthermore, “workers,” “employees,” and “staffers” indicate concern about the USAID personnel, implying the humanitarian impact of the shutdown derives from unemployment and loss of ability to work for countless individuals.

The word cloud illustrates key policy responses and actions with “freeze,” “shutdown,” “efficiency,” “assistance,” “impact” depicting the actions performed by the administration and other resultant effects that followed. The words “lawsuit,” “judge,” and “rights” are suggestive of intent to counter or support the shutdown through legal or civil advocacy action, which demonstrates some level of activism or oversight by civil society or concerned institutions. As a result, the cloud of words summarizes the narratives encircling the shutdown of USAID while depicting relevant dimensions associated with policy choices, foreign aid, unemployment problems, and other politics. The analysis of the word cloud discloses the issues that were covered in the media analysis as pertaining to the USAID shut down, which confirms the existing literature on media framing and the communication of public policy. The clusters of words “government” and “aid” which contain the macros “USAID,” “Trump,” “agency” validate the argument that the shutdown was predominantly viewed as a political issue as well as an administrative concern. This corresponds with Entman (1993) and his capturing theory of “framing” which posits that media narratives focus on certain aspects of an issue that is more appealing to the intended audience. As Walter and Ophir (2019) have shown in their studies, the framing of media coverage greatly impacts public reactions, perceptions, and behaviors. Media framing impacts how people interpret, prioritize, and emotionally respond to events, by determining how the issue will be reported. The collection of words which includes funding, programs, offerings, and employees suggest that the media equally covered the shutdown as one relating to the humanitarian crisis posed by the need to safeguard humanitarian operations.

Beyond the administrative account, the cloud indicates a pronounced concern with international relations and foreign policy due to the occurrence of words such as “foreign,” “international,” “development,” and “countries.” This supports Cooley and Ron (2002) claims that aid institutions operate in a highly militarized context because there are geopolitical consequences to the inflow and outflow of funds. The mention of “China,” “Russia,” and Washington suggests that media attention linked the suspension of USAID funding to international power relations and competition. Dupuy et al. (2016) shown that the cuts in foreign aid are frequently preceded or accompanied by abusive international relations and are more likely to be an opportunity for other major powers to consolidate their hegemony in those areas. The media's concentration on these issues is captured by the combination of these words.

Another relevant subset is the impact of operational and organizational components of personnel affairs as captured in “workers,” “employees,” “staffers,” “lawsuit,” and “judge.” This is consistent with Pallas and Sidel's (2020) study that noted government control spending that is targeted towards humanitarian aid organizations often tends to lead to wage disputes, staff disorientation, and legal actions against the government. The phrases “shutdown,” “freeze,” and “funding” further suggest that the capability of USAID to carry out its functions became a matter of journalistic scrutiny, which corroborates other research that investigated the effect of budgetary cuts on humanitarian assistance and employee retention (Rubenstein, 2017). Those legal facets identified by “lawsuit” and “judge” imply that there are allegations of legal controversies that would oppose the restructuring of the agency which suggests that policy choices invite court action (Edwards, 2014).

As a final point, the discourse around the consequences of the shutdown for the country and global community is encapsulated in the words 'security', 'assistance', 'impact', and 'congress'. The study by Lazer et al. (2018) showed that foreign policy decisions on assistance to aid agencies are typically preceded with discussions on national security, economic development, and foreign relations. The merging of terminology pertaining to economy, governance, and humanitarianism suggests that the portrayal of the shutdown was disastrous not just for USAID staff but for global development. This study, using computational methods for the analysis of media discourse, extends the existing body of literature by arguing that word cloud images function as devices for the synthesis of large amounts of text information in the context of these-called policy conflicts in the press.

An analysis of media portrayals regarding the USAID discontinuation within the larger framework of U.S. foreign policy indicates that the narrative is constructed around national considerations, political views, and global stories. Herman and Chomsky (2002) argue that American media typically construes foreign aid within the context of national security and economic efficiency, as supportive or critical of aiding expenditures. Such framing has the effect of supporting the foreign aid perception, as it legitimizes the expenditure and equally promotes skepticism about the aid's efficacy. On the other hand, international media, especially in the recipient countries, is likely to frame the shutdown either as a betrayal of global commitments or as a change in the center of influences (Bennett & Segerberg, 2013). European media may accentuate the aggravation of humanitarian issues while Chinese and Russian media may use the occasion to challenge U.S. leadership on global issues (Zhang, 2020). Such differences in framing reinforce prevailing political narratives and influence the way societies construct understandings of U.S. foreign aid policies. With these various viewpoints, the discourse analysis could demonstrate more conclusively how media shapes the discourse around aid policies and how different narratives frame reality.

CONCLUSION

The results of the research carry out the importance of media discourse in relation to the public understanding of the USAID halt alongside government policy, international aid, human resource issues, and legal matters. This study has contributed a new methodological approach for extracting salient features in the news narratives of the 'word cloud' phenomenon using narratives through the lenses of journalism which display the coexisting political, economic, and diplomatic motives that underpin the formulation of policies. The prominence of terms related to government actions, international relations, and workforce impacts confirm that the shutdown was not simply an administrative action, but in fact a complex occurrence that had severe repercussions on international development.

This research helps the study of political communication and media framing by illustrating how word cloud visualization can unlock dominant narratives in media coverage through the lens of computational text analysis. This study also analyzed the impact of the media on public perception and policy using NLP techniques, showing the breadth of media framing as a significant factor in policy discourse. The results highlight the importance of policymakers exercising strategic communication and openness since media narratives fundamentally affect public trust, political legitimacy, and governance. Further investigation should include analysis of feelings expressed, comparisons between different countries, and study of social media dialogues to enhance understanding of the media's impact on political decision-making in a digitally driven context.

As for non-academic implications, this research is relevant to the foreign policy practitioners, media specialists, and staff of international organizations. By framing public opinion and policy debates, media attention shapes the anticipated public response towards governmental actions, which gives more room to logical concern addressing the aid's transparency, efficacy, and calls for

communication in case turbulence of political or economic nature arises. The occurrence of legal and diplomatic word clouds implies that public controversies about foreign aid policies quite often result in judicial and legislative actions, suggesting the necessity of prompt policy dialogue and institutional accountability.

In terms of methods, it has been suggested that computational text analysis is applicable in media and policy research, giving word cloud visualizations as an example of how large-scale discourse data can be summarized. Further work could investigate more sophisticated linguistic models of media bias like sentiment analysis, topic modeling, or network analysis and consider the intricacies of political discourse and public opinion formation. Including social media discourse or adopting phronetic cross-national comparisons could further shed light on the differences in responses to changes in the foreign aid policy within higher order systems.

In the end, this study insists again that media do not only narrate reality, but they stage it in a way that deeply affects public opinion and policy making. As governments and global institutions operate in an environment with increasingly polarized politics, the need to understand the role of media in constructing policy legitimacy, public confidence, and international relations becomes critical. For effective global development communication in the future, more stringent and objective standards that foster civic participation and responsible decision-making in policy processes will have to be applied.

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