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Moral Foundations of U.S. Political News Organizations

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Abstract

The media ecosystem has grown, and political opinions have diverged such that there are 12 competing conceptions of objective truth. Commentators often point to political biases in 13 news coverage as a catalyst for this political divide. The Moral Foundations Dictionary (MFD) facilitates identification of ideological leanings in text through frequency of the occurrence of certain words. Through web scraping, the researchers extracted articles from popular news sources' websites, calculated MFD word frequencies, and identified words' 17 respective valences. This process attempts to uncover news outlets' positive or negative 18 endorsements of certain moral dimensions concomitant with a particular ideology. In 19 Experiment 1, the researchers gathered political articles from four sources. They were unable 20 to reveal significant differences in moral or political endorsements, but they solidified the 21 method to be employed in further research. In Experiment 2, the researchers will expanded 22 their number of sources to 10 and analyzed articles that pertain to two specific topics: the 23 2018 confirmation hearings of U.S. Supreme Court Justice Brett Kavanaugh and the partial U.S. Government Shutdown of 2018-2019. Once again, no significant differences in moral or political endorsements were found.

27 Keywords: politics, morality, psycholinguistics

## Moral Foundations of U.S. Political News Organizations

In the United States, today's media landscape affords consumers a multitude of options 29 for obtaining political news. Since the advent of cable news networks and the World Wide 30 Web in the last decades of the twentieth century, consumers have gained access to an 31 ever-expanding menagerie of news sources, many of which can be called up via a simple click, touch, or swipe. Concurrent with this growth in available news sources, concerns regarding political bias in news reporting have entered public consciousness. For example, commentators argue that networks including Fox News Channel and MSNBC communicate political news from a conservative and liberal slant, respectively. These purported biases have been a cause for concern given the potential for incomplete or inaccurate news reporting potentially resulting from these biases. Given the inherently moral nature of many political arguments and positions, bias in news reporting might manifest as differing moral appeals. Specifically, the use of differing moral language in political articles might be an 40 indicator of political bias in news media.

Morality and ethics have been of interest to thinkers, academics, and philosophers since
antiquity. Starting chiefly in the twentieth century, a scientific approach to humans'
understanding of morality emerged under the domain of psychology. Theories attempting to
explain the development and application of people's moral intuitions built the foundation for
the subfield of moral psychology. As the field developed, however, considerable debate has
taken place regarding operational definitions of "morality." Concerns regarding
operationalization remain an issue in the field in the twenty-first century as researchers
attempt to infer moral and political leanings from text and speech.

## 50 Moral Foundations Theory

As a discipline, modern moral psychology started in the late 1960s with Lawrence 51 Kohlberg (Haidt & Graham, 2007). Kohlberg's research popularized his theory of the development of moral reasoning. This theory establishes the steps of moral reasoning through which humans proceed as their cognitive structures assume higher levels of sophistication and nuance (Kohlberg & Hersh, 1977). Kohlberg borrowed from Jean Piaget's stages of cognitive development in which children progress from the sensorimotor through to the formal operations stage. Similarly, Kohlberg found people typically start with a "pre-conventional" understanding of morality during infancy in which children understand "right" and "wrong" purely in terms of how they interact with resultant experiences of rewards and punishment. Typically, people progress through several steps until they reach a "post-conventional" ethics. People who have reached the post-conventional stage are said to be able to weigh competing 61 abstractions and reason their way to a conclusion that promotes justice based upon their "self-chosen ethical principles" (Kohlberg & Hersh, 1977). From Kohlberg's perspective, 63 issues of justice and fairness comprise the foundation of morality (Haidt & Graham, 2007). This view persisted until it encountered criticism in the early 1980s.

Kohlberg's conception of morality faced major scrutiny from psychologist Carol
Gilligan. In 1982, Gilligan criticized Kohlberg's theory on the grounds that it focused solely
on the moral concerns of men, and that it ignored those of women (Haidt & Graham, 2007).
Gilligan drew attention to purported differences in the ways men and women are taught to
relate to self and others. She offered a historic argument contending women have
traditionally filled roles related to caring and nurturing. She pushes back against Kohlberg's
assumption that moral development replaces "rule of brute force," as enforced by men, with
the justice-based "rule of law." According to Gilligan, this assumption implies women are
less morally developed, owing to their absence both in masculine displays of violence as well
as in enforcement of the law (Gilligan, 1982). Gilligan argues for the existence of a distinct,

but equal development process that women and girls must undergo in order to develop their moral selves. Stark differences in the ways women are traditionally taught to interact with their social world cause them to develop ethical systems based upon their non-aggressive relationships with others. Gilligan thus asserted morality was built upon an alternative moral foundation: caring (Gilligan, 1982). This debate between competing conceptions of morality did not resolve until Gilligan and Kohlberg conceded the existence of two moral foundations: justice and caring (Haidt & Graham, 2007). While this new direction in moral psychology appeared to represent a more inclusive outlook on the construct, these novel ideas would soon be challenged on the grounds of its apparent western-centric outlook.

Jonathan Haidt and Jesse Graham formulated Moral Foundations Theory as a method by which to capture the entirety of humans' moral domain (Haidt & Graham, 2007). The researchers argued older theories of moral psychology were focused primarily on issues of justice, fairness, and caring - individually focused foundations of morality that align with the beliefs of political liberals (Haidt & Graham, 2007). In other words, moral psychology ignored the valid moral foundations of conservatives. Moral Foundations Theory (MFT) holds that people's moral domain can be mapped by quantifying their endorsement of five moral foundations: harm/care, fairness/reciprocity, ingroup/loyalty, authority/respect, and purity/sanctity (Haidt & Graham, 2007).

In their brief overview of the history of moral psychology, Graham, Haidt, and Nosek (2009) explained Shweder, Much, Mahapatra, and Park's objections to moral psychology as it stood in the late 1980s. Their criticism centered on the fact moral psychology concerned itself with issues regarding justice and individuals' rights. Such a system, they argued, did not account for moral concerns outside of the western world (Graham et al., 2009). Individually focused concerns can be grouped under an overarching "ethic of autonomy," which was thought to be one of three ethics upon which humans base moral decisions. The other two ethics were the "ethic of community" (comprising one's duty to their family, tribe,

etc.), and the "ethic of divinity" - representing one's duty not to defile their God-given body and soul (Graham et al., 2009). In the 2000s, Haidt and Graham (2007) took this line of reasoning further in their assertion that moral psychology favored certain political ideologies over others.

Haidt and Graham settled on these specific foundations after the completion of a 106 literature survey of research in anthropology and evolutionary psychology (Graham et al., 107 2011). The researchers attempted to locate virtues and morals corresponding to 108 "evolutionary thinking." For instance, the researchers cited Mauss' work on reciprocal gift-giving, which informed the establishment of the fairness/reciprocity foundation. 110 Additionally, evolutionary literature on disgust and its correlation to human behavior regarding food and sex informed the purity/sanctity foundation (Graham et al., 2011). The 112 researchers identified the five "top candidates" for the foundations of human cultures' 113 morality (Graham et al., 2011). 114

The first two foundations (harm/care and fairness/reciprocity) are termed the 115 "individualizing foundations," as they are centered on the concerns of individuals rather than 116 groups. harm/care represents an endorsement of compassion and kindness, while opposing 117 cruelty and harm. Fairness/reciprocity represents concerns centered on guaranteeing 118 individual rights as well as justice and equality among all people. The other three 119 foundations (ingroup/loyalty, authority/respect, and purity/sanctity) are the "binding" 120 foundations, owing to their focus on group-related concerns, rather than those of individuals. 121 Ingroup/loyalty represents endorsements of patriotism and heroism and discourages nonconformity and dissent. Authority/respect represents an endorsement of social hierarchies and traditions while denigrating disobedience. Finally, purity/sanctity represents concerns 124 regarding chastity and piety, while discouraging vices and indulgences, including lust, avarice, 125 and gluttony (Haidt & Graham, 2007). Liberals tend to endorse the individualizing 126 foundations more than conservatives. Conservatives, on the other hand, tend to endorse the 127

binding foundations more than liberals. It should be noted, however, conservatives also tend to endorse all five foundations equally, implying they base moral judgments on all foundations (Graham et al., 2009).

Moral Foundations Theory has received criticism on the grounds that its assumptions 131 regarding moral intuitions have little empirical basis. Suhler and Churchland (2011) list 132 several potential weaknesses of MFT that they argue might threaten the theory's validity. 133 First, the authors challenge Haidt and Graham (2007)'s claims the moral intuitions 134 represented by MFT are innate and modular. Suhler and Churchland (2011) claim that 135 advances in biological sciences (embryology and microbiology, specifically) make it more difficult for researchers to claim any one trait is either innate or learned through experience. Rather, behaviors likely result from interactions between genetics and experience (Suhler & Churchland, 2011). According to the authors, without solid data supporting the innateness 139 of moral foundations, Haidt and Graham have little from which to make such a claim. 140 Similarly, Haidt and Graham (2007) rely on evidence authored by evolutionary psychologists 141 to make a "strong modularity claim" (Suhler & Churchland, 2011). However, as with 142 innateness, there is little neurobiological evidence to support modularity. 143

Suhler and Churchland (2011) also criticized the content and taxonomy of the five 144 foundations. The authors criticize Haidt and Graham (2007)'s omissions of additional 145 foundations, including *industry* and *modesty*, claiming these concepts are moralized in many 146 societies worldwide. Likewise, the authors question whether or not the foundations are 147 sufficiently distinct as to stand as their own foundation. For example, Suhler and Churchland (2011) posit that *ingroup/loyalty* is merely a group-focused version of *harm/care*. Work by Graham et al. (2011) might serve to rebut this criticism, as the researchers found their original five-factor structure seemed to best fit the data when validating the Moral 151 Foundations Questionnaire. Finally, Suhler and Churchland (2011) point out that particular 152 concepts related to a foundation, including "anger" in fairness/reciprocity and "deception" in 153

ingroup/loyalty, could be ascribed to any of the other foundations as well. In other words, it becomes difficult to recognize a particular concept as indicative of any one foundation when, in theory, they could be applied to all five (Haidt & Graham, 2007; Suhler & Churchland, 2011).

These criticisms of Moral Foundations Theory are valid and should be taken into 158 consideration when conducting research with instruments derived from MFT. The current 159 authors argue these criticisms are especially valid when considered alongside questions 160 regarding the Moral Foundations Dictionary they state herein. However, there exists 161 compelling evidence regarding the validity of Moral Foundations Theory, albeit regarding its 162 application solely through the Moral Foundations Questionnaire. This evidence is discussed 163 within a brief explanation of the Moral Foundations Questionnaire and its relationship to the 164 Moral Foundations Dictionary. 165

# 166 Moral Foundations Dictionary

In order to capture language's role in moral and political reasoning, Graham et al. 167 (2009) formulated the Moral Foundations Dictionary (MFD) in order to capture moral 168 reasoning and justification as used in speech and text. The MFD is composed of 259 words, 169 with around 50 words assigned to each of the five foundations. The researchers created a 170 preliminary list of words that they believed would be associated with the five foundations. 171 Then, using the Linguistic Inquiry and Word Count (LIWC; Pennebaker, Booth, & Frances, 172 2007) computer program, they analyzed transcripts of liberal and conservative Christian sermons in order to obtain frequencies of the occurrence of words from the researchers' initial list. The researchers manually checked the results from LIWC in order to make sure the results make sense given the contexts and rhetorical devices used in the sermons, as word 176 frequency analysis ignores sentence context. The researchers offered the following example 177 from a Unitarian sermon as a demonstration of ambiguous statements requiring human 178

verification: "Don't let some self-interested ecclesiastical or government authority tell you what to believe, but read the Bible with your own eyes and open your heart directly to Jesus" (Graham et al., 2009). This sentence added to the *authority/respect* total in LIWC's analysis, but it appears to suggest that one should reject authority in this context. The researchers eliminated this sentence from the *authority/respect* raw count on account of this discrepancy between the use of authority-related words and the speaker's clear intentions (Graham et al., 2009).

Similar to previous research on Moral Foundations Theory, liberal ministers used *harm*,

fairness, and ingroup words more often than conservative ministers. Conversely, conservative

ministers used authority and purity words more often than liberal ministers. However,

conservative ministers did not use ingroup/loyalty words more than liberals. Rather, liberal

ministers used words pertaining to ingroup/loyalty, but in contexts that promote rebellion

and independence - causes opposite to positive endorsements of that foundation (Graham et

al., 2009).

To this point, most text analysis utilizing the Moral Foundations Dictionary 193 operationalizes endorsement of any one of the foundations as percent occurrence of words in 194 a given text from the foundation's respective word list. As such, most analyses assume that 195 zero percent occurrence is indicative of no endorsement, while any non-zero percent 196 occurrence indicates endorsement of the foundation. This operational definition may not be 197 sufficient in describing the true nature of the writer or speaker's endorsement of one of the 198 sets of moral intuitions. A quick glance at the MFD words for harm/care reveals the presence of words that are more closely associated with universally accepted conceptions of harm over care and vice-versa (Graham et al., 2009). For example, the word "cruel" has 201 relatively negative connotations compared to "benefit." For the harm/care foundation, it is 202 conceivable that use of the word "cruel" might indicate a greater attentional focus of the 203 idea of harm rather than care.

For harm/care, the definition of the foundation, as well as its name, clearly 205 distinguishes between two somewhat opposite sides of an attentional continuum, with harm 206 on the negative end and care on the positive side. In other words, the entries in the MFD for 207 harm/care have somewhat clear positive and negative valences. The same pattern can be 208 seen in the MFD entries for the other four foundations. Purity/sanctity features words that 200 likely have a negative valence to most observers, including "disease" and "trash," along with 210 more positive words, including "right" and "sacred" (Graham et al., 2009). These 211 dichotomies, however, bring up other questions regarding the definition and names of the 212 other four foundations apart from harm/care: fairness/reciprocity, ingroup/loyalty, 213 authority/respect, and purity/sanctity. The latter four foundations have names that are 214 harder to understand as a valence continuum, as the concepts in the names are more similar, 215 even to the point of being virtually synonymous in the case of fairness/reciprocity.

When considering the issue of positive versus negative valence in MFD words, the 217 question of how texts are analyzed vis-a-vis the MFD remains. How can raw percentage of 218 MFD word occurrence capture the valence and focus of the writer or speaker? If 2% of a 219 politician's speech features positive words (i.e., "benefit" and "defend") from the MFD 220 harm/care list, how can researchers be sure the level and nature of the speaker's 221 "endorsement" of the foundation equals that of another politician whose speech contained 222 negatively connoted MFD words from the harm/care list? They would have equal 223 endorsements as far as the numbers are concerned, but the words used and focus given are 224 on opposite sides of the harm/care spectrum. 225

This issue is compounded by the fact the Moral Foundations Questionnaire (MFQ) and its subscales assume endorsement lies on a continuum. The MFQ, which was developed subsequent to the MFD, measures individuals' endorsements of each of the foundations using a six-point scale (Graham et al., 2011). The questionnaire is made up of judgment items and relevance items. Judgment items are phrased such that the respondent signals their

agreement or disagreement with straightforward statements. An example of such a statement
reads: "It can never be right to kill another human being" (Graham et al., 2011). Relevance
items gauge the respondent's opinion regarding the importance of foundation-related
concerns. For example, the respondent is directed to rate how important the following
situation is to their sense of morals: "whether or not someone did something disgusting."
This example measures the relevance of the purity/sanctity foundations. Each foundation has
a judgment and relevance subscale, totaling 10 subscales for the MFQ (Graham et al., 2011).

The Moral Foundations Questionnaire has been validated by multiple researchers. 238 Likewise, its five-factor structure has been demonstrated to fit data in multiple countries (Davies, Sibley, & Liu, 2014; Graham et al., 2011). In their article introducing the 30-item MFQ, Graham et al. (2011) conducted an exploratory factor analysis (EFA) and found that 241 a five-factor model fit the data better than a one, two, or three-factor model. Davies et al. 242 (2014) conducted a confirmatory factor analysis (CFA) of the MFQ with a sample from New 243 Zealand and likewise found the five-factor model provided the best fit. While Davies et al. (2014) concede the US and New Zealand share many similarities as Western nations, which 245 could raise questions regarding the validity of the MFQ in non-Western nations. However, 246 there are striking differences between the two countries, including the lack of a two-party 247 political system in New Zealand, that provide grounds for claiming the MFQ generalizes 248 beyond the United States. Furthermore, Graham et al. (2011) claim to find a "reasonable" 249 degree of generalizability for the MFQ across participants from many different regions in the 250 world. These two bodies of work also provide the best available evidence that the five moral 251 foundations are sufficiently distinct from one another, though broader criticisms of MFT 252 raised by Suhler and Churchland (2011) should still be taken into account in studies 253 involving the theory.

The aforementioned ambiguity of the Moral Foundations Dictionary as an instrument becomes clearer upon closer examination of the items in the Moral Foundations

Questionnaire. One item under the fairness/reciprocity judgment subscale reads, "Justice is 257 the most important requirement for a society" (Graham et al., 2011). The survey respondent 258 must select a number on a scale from 1 to 6 indicating responses spanning "strongly 259 disagree" at 1 to "strongly agree" at 6. While the scales in the MFQ do not represent true 260 valence as it pertains to individual words, it does allow for a greater degree of specificity in 261 terms of an individual's endorsement of a particular moral foundation. When a respondent 262 selects a 4 for the aforementioned MFQ statement, they clearly are indicating they "slightly 263 agree" with the statement (Graham et al., 2011). This specificity is not present in most 264 analyses involving the MFD and percent occurrence, unless they also take into account the 265 valence of the words used in the text or speech of interest. 266

#### 267 Valence

Borrowing from Osgood's work in the 1950s, Bradley and Lang (1999) recognized 268 valence as one of three related dimensions comprising emotion when developing their 269 Affective Norms for English Words (ANEW). As mentioned before, "valence," the first 270 dimension, denotes the pleasantness of a given word. "Arousal," the second dimension, 271 describes the stimulating nature of a word. Lastly, "dominance" or "control" describes the 272 extent to which a word makes one feel in or out of control (Bradley & Lang, 1999). The 273 researchers developed ANEW by presenting participants with a list of 100-150 words and 274 asking for them to rate the word on all three dimensions using the Self-Assessment Mannikin (SAM), which allows ratings along either a nine-point scale when using traditional paper instruments or a twenty-point scale when using a computerized version.

Participants saw the stimulus word and responded on each scale. The valence scale
featured a smiling figure at one end (representing pleasantness) and a frowning figure at the
other end (for unpleasantness). The arousal scale had a "wide-eyed" figure at one end with a
sleepy figure at the other, representing stimulating and unstimulating respectively. Finally,

the dominance scale featured a large figure, indicating the highest degree of control, at one end and a small figure, indicating a lack of control, at the other end (Bradley & Lang, 1999).

The end result of this procedure yielded affective norms along the three dimensions for 1,040 English words (Bradley & Lang, 1999). ANEW represented an important first step in establishing affective norms for large numbers of English words. However, later researchers found the 1,040-word list to be limiting for a language consisting of thousands of words.

Warriner, Kuperman, and Brysbaert (2013) exponentially lengthened the list of words 288 with affective norms to 13,915 English lemmas, the base forms of words without inflection 280 (i.e., "watch" rather than "watched" and "watching"). The researchers recognized the 290 importance of affective norms in several areas of study, including emotion, language 291 processing, and memory (Warriner et al., 2013). They argue the list of words included in 292 ANEW is sufficient for small-scale factorial research designs, but the list is "prohibitively 293 small" for larger-scale "megastudies" that are common in psycholinguistic research today 294 (Warriner et al., 2013). 295

In order to source a large number of lemmas for affective ratings, the researchers drew 296 from several validated sources. These include the 30,000 lemmas with age-of-acquisition 297 (average age at which a particular word is learned) ratings gathered by Kuperman, 298 Stadthagen-Gonzalez, and Brysbaert (2012) as well as the content lemmas from the 299 SUBTLEX-US corpus consisting of subtitles from various forms of visual media (New, Brysbaert, Veronis, & Pallier, 2007). This data collection resulted in the final list of 13,915 lemmas. Lists of 346-350 words were presented to participants recruited through the 302 Amazon Mechanical Turk subject pool. Participants rated the words along one of the three 303 dimensions, unlike the ANEW project in which participants rated each word along all three 304 dimensions at once. The researchers used a nine-point scale similar to the one used by 305 Bradley and Lang (1999) when collecting ratings for ANEW (Warriner et al., 2013). 306

The researchers noted several points of interest upon observing ratings. First, they

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found that valence and dominance ratings had a negative skew, indicating more words
elicited feelings of happiness and control than their respective opposites. Also, when
examining the relationship between valence and arousal ratings, the researchers found a
U-shaped relationship. This U-shape indicates words with high degrees of positivity and
negativity elicited higher arousal (Warriner et al., 2013). These observations along with the
now-greatly expanded list of affective norms has been applied to several lines of inquiry in
psycholinguistics.

Warriner and Kuperman (2015) utilized the new affective norms list in order to 315 investigate the validity of the Pollyanna hypothesis, or the prevalence of a generally 316 optimistic outlook in humans as reflected in language. The researchers were able to conclude 317 the existence of a greater number of positive-valence English words in the list of 13.915 318 lemmas. Additionally, after observing token frequency in a number of text corpora, including 319 SUBTLEX-US, the Corpus for Contemporary American English (COCA), the British 320 National Corpus (BNC), Touchstone Applied Science Associates, Inc. Corpus (TASA), and 321 the corpus used for the Hyperspace Analogue to Language model (HAL), the researchers 322 found that words with positive valence were also used more frequently (Warriner & 323 Kuperman, 2015). While the researchers concede the possibility of an acquiescence bias in 324 ratings as a possible explanation for the observed positivity bias, this investigation represents 325 one application of the Warriner et al. (2013) list in emotional studies. 326

In addition to applications in emotion research, the Warriner et al. (2013) norms have
been utilized in cognitive research as well. One cognition-based study investigates the
relationship between emotion and response latencies in word recognition. Kuperman, Estes,
Brysbaert, and Warriner (2014) sought to use these new norms to fill in the knowledge gaps
regarding variance in word recognition. The researchers drew several conclusions regarding
emotion and word recognition (specifically in naming and lexical decision tasks - two
cognitive processing tasks wherein a participant has to read aloud or judge a word for its

lexicality). First, Kuperman et al. (2014) found slower decision-making and reading times in negative-valence words, faster times in neutral words, and even faster times in words with 335 positive valence. The researchers also concluded that words causing higher arousal tend to 336 have slower decision times than less-arousing words. They found valence had a stronger 337 effect on recognition than arousal (both effects were independent, not interactive). They 338 found an interaction between emotion and word frequency such that valence and arousal are 339 more effective on lower frequency words than high frequency words. Finally, Kuperman et al. 340 (2014) found a greater effect of valence and arousal on response latency for lexical decision tasks than for naming tasks (Kuperman et al., 2014). This research serves as further 342 evidence that the Warriner et al. (2013) list can be used for research inquiries both within 343 and without the field of psycholinguistics.

In the present studies, the researchers used the Warriner et al. (2013) list in order to 345 denote the valence of the words appearing in the news articles scraped from the internet. 346 Valence was considered as another independent variable and its relationship with the words 347 comprising the Moral Foundations Dictionary were of chief interest to the researchers. The valence was used as a means to determine whether individual words in the MFD represented more positive aspects of their respective foundation or if they denoted a more negative aspect of the foundation. Specifically, valences were used to weight the MFD words by their relative degree of positivity or negativity. Incorporating word valence into a study involving 352 the MFD is meant to alleviate some of the issues regarding the aforementioned ambiguity 353 regarding the words in the Moral Foundations Dictionary. 354

### News Media and Politics

Research into politics, language, and media has illuminated the complex relationships
between all three. Any politically-oriented discussion of word occurrence as an implication of
moral or political position assumes that language and ideology are intrinsically linked.

Deborah Cameron (2006) points out the expressive nature of ideological beliefs and how that expression is conveyed through language, thus implying a connection between ideology and 360 language. She goes on to criticize the notion that language is either the "pre-existing raw 361 material" used to shape ideologies or the "post-hoc vehicle" for their propagation. Rather, 362 the structure of language itself is shaped by ideology and social processes even when it is used 363 to explain or express ideologies (Cameron, 2006). Owing to the fact the Moral Foundations 364 Dictionary was developed in order to assess the moral, which includes the ideological, 365 orientation of discourse, its purported ability to assess parts of the structure of language (vocabulary) for ideological lean is of chief interest to the researchers in the present study. 367

The use of language both to express and further an ideological goal has been 368 documented in the techniques employed by candidates for political office in the U.S., 369 Druckman, Jacobs, and Ostermeier (2004) considered political "issues" as communication 370 that attempts to persuade constituents to vote for the candidates based on their strengths in 371 matters of public policy. According to the researchers, "image" priming describes techniques 372 deployed in order to sway votes based on favorable aspects of the candidate's behavior and 373 personality (Druckman et al., 2004). The researchers investigated political issue and image 374 priming on the part of candidates as implied by the disproportionate attention candidates 375 paid to particular issues over others. The researchers found numerous examples of issue and 376 image priming during the 1972 re-election campaign of Richard Nixon. 377

They linked the Nixon administration's awareness of the issues for which the president had public support to the issues he should emphasize (and prime) during the campaign.

Likewise the researchers found evidence that Nixon's team was aware of negative evaluations of his warmth and trustworthiness, and thus took steps to prime his purportedly positive qualities, including strength and competence (Druckman et al., 2004). The researchers also cited research from Iyengar and Kinder (1987) suggesting the news media affected perceptions of President Jimmy Carter's competence by emphasizing (e.g., priming) issues

related to energy, defense, and the economy. This focus implies news media may contribute to Americans' perception of politicians based on where the media places emphasis.

There is a potential caveat regarding the validity of Druckman et al. (2004)'s findings: 387 reproductions of several studies purporting to demonstrate social priming effects have failed 388 to replicate the original results. Pashler, Coburn, and Harris (2012) point out the distinction 389 between perceptual and social (or goal) priming both in their operational definitions as well 390 as their replicability. Perceptual priming often works through the inducement of a certain 391 response from a related prime, as in, for example, semantic priming. Social (or goal) priming 392 encompasses phenomena by which people exhibit complex behavioral changes subsequent to 393 exposure to a prime. Pashler et al. (2012) point out well-known studies investigating social priming, including the use of elderly-related primes to induce slower walking speeds in 395 participants. Studies investigating perceptual priming have been "directly replicated in 396 hundreds of labs" (Pashler et al., 2012). This replication rate does not appear to be the case 397 for social priming, as argued by Pashler et al. (2012). 398

Pashler et al. (2012) noticed the unusually large effect size values (Cohen's d) reported 390 by researchers studying social priming effects. The researchers reproduced two studies from 400 Williams and Bargh (2008) The first study attempted to prime participants by having them 401 plot points on a Cartesian grid. The independent variable was priming condition and 402 contained three levels: short, middle, and long distance. Those instructed to plot points 403 further apart were hypothesized to express a higher degree of psychological distance 404 regarding their family. The second study used the same priming conditions, but hypothesized that greater distance between points would prime participants to estimate fewer calories in unhealthy foods than those who were primed with shorter distances between points. Pashler et al. (2012) concluded those two studies from Williams and Bargh (2008) held little validity 408 while also casting doubt on the prevalence of social priming effects themselves, based on the 409 inability of other researchers to replicate previously reported effects in this area. 410

While these concerns regarding the replication of social priming studies are valid and 411 deserve further investigation, Druckman et al. (2004) does not purport to demonstrate a 412 widespread effect of social priming on the American electorate. In other words, this research 413 makes no claim to empirically supported priming effects. Rather, Druckman et al. (2004) 414 chronicle the efforts on the part of the Nixon Administration to prop up the president's 415 supposed strengths while downplaying his weaknesses. These tactics were deployed through 416 the careful use of language in order to achieve the administration's political goals. As such, 417 Druckman et al. (2004)'s research on Nixon serves as an example of language's potential 418 utility in the propagation of desirable political opinions. The researcher's investigation of 419 news media's focus on specific issues during the Carter Administration likewise provide an 420 example of language as a potential conduit for the transfer of politically biased information. 421 The idea that even 1970s news media could contain political biases is of particular interest to 422 the current study, which investigates similar phenomena in contemporary news media. 423

Other research into news media suggests certain media outlets, at least indirectly, may 424 have an effect on the voting records of representatives in Congress (Clinton & Enamorado, 425 2014). Specifically, the researchers identified a pattern of declining support for President Bill 426 Clinton's policies chiefly among Republicans in the House of Representatives after the Fox 427 News Channel began broadcasting on cable and satellite systems in their respective districts. 428 As Fox News was, at the time of its launch in 1996, the only outwardly ideological national 429 news network, the researchers were able to track its spread across the country and observe 430 voting records of members of Congress both before and after Fox News' arrival. The 431 researchers concluded that members of Congress, excluding those newly elected at the time 432 of Fox News Channel's emergence, attempted to anticipate resultant conservative-leaning 433 shifts among their constituents by bolstering their conservative voting record before the next 434 election (Clinton & Enamorado, 2014). 435

Therefore, the current study sought to combine both methods related questions and

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extension/replication of previous moral foundation results found for liberal and conservative sources. First, the MFD was combined with previous research by the current authors (see below) and weighted by valence to create weighted percentages to better specify endorsement. Second, these weighted percentages were examined for their differences in across liberal and conservative news sources.

### Experiment 1

443 Method

For Experiment 1, the researchers approached the study with the intention to answer a 444 method question. That is, this portion of the current research was conducted in order to 445 solidify the best method by which to analyze political news text under the Moral 446 Foundations Theory framework while also alleviating some of the aforementioned valence 447 problem observed in the Moral Foundations Dictionary. The researchers hypothesized the 448 news sources generally perceived as liberal leaning (NPR and The New York Times) would 449 contain MFD words and valences indicating endorsements of the individualizing moral 450 foundations (harm/care and fairness/reciprocity). Additionally, the researchers hypothesized 451 the two sources generally perceived to be conservative leaning (Fox News and Breitbart) 452 would feature MFD words and valences indicating equal endorsement of all five foundations. 453 Owing to the lack of a need for human participants, the researchers did not petition Missouri 454 State University's Institutional Review Board, as no such approval was needed to conduct this study.

## 457 Sources

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Political articles were collected from the websites of four notable U.S. news sources, a process known as web scraping. The sources were *The New York Times, National Public* 

Radio (NPR), Fox News, and Breitbart. They were selected for their widespread recognition 460 and the fact political partisans have strong preferences for some sources over others. The 461 researchers determined the political lean of each source by referencing Mitchell, Matsa, 462 Gottfried, and Kiley (2014)'s article demonstrating the self-reported ideological consistency 463 represented by the consumers of several news sources. In general, The New York Times and 464 NPR are preferred by consumers reporting a liberal bias or lean. In contrast, Fox News and 465 Breitbart are believed to have a conservative bias or lean. Mitchell et al. (2014)'s article 466 presented political ideology as a scale ranging from "consistently liberal" to "consistently 467 conservative." In between these extremes lie more moderate positions, including "mostly 468 liberal," "mixed," and "mostly conservative." Owing to the lower number of sources analyzed 469 herein, the researchers elected to categorize the sources as either "liberal" and "conservative" 470 in order to form a basis for comparison.

Political articles in particular were identified and subsequently scraped by including
the specific URL directing to each source's political content in the R script. For example,
rather than scrape from nytimes.com, which would return undesired results (non-political
features, reviews, etc.), we instead included nytimes.com/section/politics so that more or less
exclusively political content was obtained. All code for this manuscript can be found at
https://osf.io/5kpj7/, and the scripts are provided inline with this manuscript written with
the papaja library (Aust & Barth, 2017).

Identification of the sources' political URLs presented a problem for two of the sources
owing to complications with how their particular sites were structured. While in the
multi-week process of scraping articles, we noticed word counts for NPR and Fox News were
not growing at a similar pace as those from The New York Times and Breitbart. Upon
investigation, we found another, more robust URL for political content from NPR: their
politics content "archive." The page structure on NPR's website was such that only a limited
selection of articles is displayed to the user at a given time. Scraping both the archive and

the normal politics page ensured we were obtaining most (if not all) new articles as they
were published. We later ran a process in order to exclude any duplicate articles. Fox News
presented a similar issue. We discovered Fox News utilized six URLs in addition to the
regular politics page. These URLs led to pages containing content pertaining the U.S.
Executive Branch, Senate, House of Representatives, Judicial Branch, foreign policy, and
elections. Once again, duplicates were subsequently eliminated from any analyses.

## 492 Materials

Using the *rvest* library in the statistical package R, we pulled body text for individual articles from each of the aforementioned sources (identified using CSS language) and compiled them into a dataset (Wickham, 2016). Using this dataset, we identified word count and average word count per source. This process was run once daily starting in February 2018 until March 2018. Starting in mid-March 2018, the process was run twice daily - once in the morning and again in the evening. Data collection was terminated once 250,000 words per source was collected in April 2018.

## Data analysis

Once data collection ended, the text was scanned using the *ngram* package in *R*(Schmidt, Gonzalez-Cabrera, & Tomasello, 2017). This package includes a word count
function, which was used to remove articles that came through as blank text, as well as to
eliminate text picked up from the Disqus commenting system used by certain websites. At
this point, duplicate articles were discarded.

The article text was processed using the *tm* and *ngram* packages in *R* in order to render the text in lowercase, remove punctuation, and fix spacing issues (Feinerer & Hornik, 2017). The individual words were then reduced to their stems (i.e., *abused* was stemmed to

abus). The same procedure was applied to the MFD words and the words in the Warriner et al. (2013) dataset. Using the Warriner et al. (2013) dictionary, the words making up each of the five foundations in the MFD were matched to their respective valence value.

Concurrent research by Jordan, Buchanan, and Padfield (2019) is assessing the validity 512 of both the Moral Foundations Questionnaire and the Moral Foundations Dictionary through 513 a multi-trait multi-method analysis of the two instruments using multiple samples. The instruments and foundation areas are being analyzed against one another, in order to test 515 reliability, as well as against the Congressional Record in order to test predictive validity for 516 political orientation. The researchers were able to identify a number of potential new words 517 that, if added to the MFD, could comprise a dictionary with greater validity, and less 518 likelihood of zero percent texts, as this often occurs with the current MFD. Those results 519 have informed this analysis, and their updated findings may change the underlying dictionary 520 used in this analysis (albeit, we do not expect any changes in the results presented below). 521

The source article words were compiled into a dataset where they were matched up 522 with their counterparts in the MFD along with their valence and a percentage of their 523 occurrence. Therefore, for each article, the percentage of the number of harm/care words 524 occurring in the articles were calculated, and this process was repeated for each of the foundations. Words' percent occurrence were multiplied by their z-scored valence. Valences were z-scored in order to eliminate any ambiguity regarding the direction of the valence. 527 Positive values indicate positive valence, and negative values indicate negative valence. 528 Words were categorized in accordance to their MFD affiliation, creating a weighted sum for 529 each moral foundation. 530

531 Results

## Descriptive Statistics

The researchers calculated descriptive statistics for each news source in order to 533 understand any and all fundamental linguistic differences in the sources' use of English. 534 Statistics calculated included z-scored valence, number of articles per source, total number of words per source, average number of tokens (words) per article in each source, average 536 number of types (unique words) per article in each source, and mean readability level per source. Readability statistics were calculated using the Flesch-Kincaid Grade Level Readability formula. Readability is calculated using a formula where the total number of 539 syllables, words, and sentences in a given passage are determinants of its difficulty. The 540 obtained value is intended to match up with the grade level at which one should be able to 541 comfortably read the passage (Kincaid, Fishburne, Robert P., Richard L., & Brad S., 1975). 542 For example, a text with a readability score of 11 should be easily read by a high school 543 junior.

As seen in Table 1, the sources are similar in some aspects yet different in others. 545 Valence appears to be slightly positive across all sources. The standard deviations seem to indicate little to no presence of a difference in valence. The New York Times published the 547 greatest number of articles as well as total words. Breitbart featured the lowest number of 548 articles, and NPR the lowest number of total words from all articles. Per individual article, however, Breitbart appears to feature the highest average number of words as well as unique words. Once again the standard deviations call into question any apparent differences between sources. Finally, Fox News appears to be the most readable source on average, while The New York Times is the least readable. This result might be attributable to the greater 553 number of tokens in the average New York Times article compared to Fox News. As before, 554 the standard deviations for readability hamper one's ability to draw solid conclusions 555

regarding differences in the sources' use of language.

#### 7 Inferential Statistics

To analyze if news sources adhered to differences in word use based on their target audience, we utilized a multilevel model (MLM) to analyze the data. MLM is a regression technique that allows one to control for the repeated measurement and nested structured of the data, which creates correlated error (Gelman, 2006). Using the *nlme* library in *R* (Pinheiro, Bates, Debroy, Sarkar, & Team, 2017), each foundation's weighted percentage was predicated here by the political lean of the news source, using the individual news sources as a random intercept to control for the structure of the data.

The multilevel model did not indicate the presence of any significant or practical effect 565 of political lean for any of the five moral foundations. The strongest effect size was observed 566 for the authority/respect foundation, but the effect was in the opposite direction from what 567 was originally hypothesized - liberal sources tended to use more authority/respect words than 568 did conservative sources. Descriptive and test statistics, p-values and effect sizes (Cohen's d) 560 can be found in Table 2. To interpret the weighted scores, one can examine the mean and 570 standard deviations for each. A zero score for the mean, with a non-zero standard deviation, 571 would indicate a perfect balance of positive and negative words in each category, likely 572 representing a neutral tone when all words are considered. Negative percentages would 573 indicate more representation of the negative words in the MFD area, while positive 574 percentages indicate an endorsement of the positive words in a MFD. Therefore, we suggest using the sign of the mean score to determine the directionality of the endorsement for the MFD (positive, neutral, negative), and the standard deviation to ensure that a zero score is not zero endorsement (i.e., a SD of zero indicates no words were used). Based on the 578 weighted percent values for the five foundations, the researchers observed that MFD words 579 seem to make up a small portion of the article text. Furthermore, the observed percentages 580

and means appear to indicate a generally positive endorsement of all five foundations across both liberal and conservative sources.

583 Discussion

The results obtained in Experiment 1 did not confirm the hypothesis. The researchers 584 found little compelling evidence of an effect of partisan lean on MFD endorsement. The 585 strongest effect found was for the authority/respect foundation owing to the fact its Cohen's 586 d value was greater than the other four foundations. However, the effect was in the opposite 587 direction of that which was hypothesized. Specifically, the results indicated that liberal 588 leaning sources demonstrated higher positivity regarding that foundation than conservatives. 580 This result is contrary not only to the research hypothesis for Experiment 1 but also to 590 previous findings in Moral Foundations Theory research. It should be noted, however, the 591 effect size was small and the relationship was not found to be statistically significant. 592

Upon speculation, the researchers identified one possible reason for why the results 593 were unable to confirm the hypothesis. The selection of the broad and amorphous topic of 594 political news" may have led to the scraping of large numbers of articles with little to no 595 moral-centric content. Rather, many articles may have been, for example, simple reporting 596 on congressional procedures that would leave little room for the use of moral language here, 597 let alone words from the Moral Foundations Dictionary. In short, the range of topics covered 598 in Experiment 1 was likely too broad. The possibility exists that a tighter focus on one 590 political issue or event, especially one that (on the surface) has a stronger relationship with 600 morality might be more illuminating for research in moral language in news media. 601

Owing to the exploratory nature of Experiment 1, the researchers were afforded the opportunity to consider changes to the method to be utilized in Experiment 2. Generally speaking, the researchers believe their methodology to be sound. Web scraping methods and

text processing remain viable methods for collecting large amounts of text and subsequently rendering that text in a form suitable for data analysis. Experiment 1 also demonstrated a method by which to address inherent problems in the Moral Foundations Dictionary relating to valence. The solution provided in Experiment 1 appears to provide insights into the MFD words where none previously existed. Finally, calculating weighted percentages and sums for each moral foundation provides an easily interpreted summary of MFD word positivity and occurrence.

While the methodology used in Experiment 1 features many strengths, there are
aspects which could be strengthened for future studies. The researchers identified two such
changes that were subsequently employed in Experiment 2. First, the researchers elected to
include more news sources for web scraping and analysis in addition to the four used in
Experiment 1. Second, the researchers chose to focus their data collection efforts exclusively
on one event in U.S. politics: the nomination and confirmation of Justice Brett Kavanaugh
to the U.S. Supreme Court. In Experiment 2, the researchers sought to confirm the
usefulness and validity of the method as well as test a similar hypothesis as Experiment 1.

### Experiment 2

### 121 Kavanaugh Supreme Court Hearing

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In the wake of Justice Anthony Kennedy's retirement from the Supreme Court of the
United States, President Donald Trump nominated Brett Kavanaugh as the new Associate
Justice. Kavanaugh was previously on the U.S. Court of Appeals for the District of
Columbia. The Senate Judiciary Committee began his confirmation hearing on September 4,
2018 (US Government, 2018a). Following allegations of sexual assault by high school
classmate Dr. Christine Blasey Ford, the committee postponed its vote on whether or not to
open the confirmation to the entire Senate.

On September 27, the committee questioned Dr. Ford before commencing a second 629 round of questioning for Judge Kavanaugh (US Government, 2018b). During the intervening 630 weeks between hearings, two more women came forward with two separate allegations of 631 sexual assault on the part of Kavanaugh. According to Nielsen reports, more than 20 million 632 people watched the September 27 proceedings on television (O'Connell, 2018). This figure 633 does not take into account viewers who watched online, nor does it account for viewers 634 outside the United States. On September 28, the Senate Judiciary Committee voted to send 635 the nomination to the Senate floor. Senator Jeff Flake of Arizona, however, lobbied for a 636 week-long FBI investigation on Kavanaugh and the allegations facing him, which the 637 committee, and later the President, approved. The investigation concluded with no 638 significant findings. The Senate voted 50-48 to approve Kavanaugh's appointment on 639 October 6, 2018 (US Government, 2018c).

The Kavanaugh nomination, confirmation hearing, and eventual swearing-in, as well as 641 the news media's coverage of all three events, feature many dimensions that likely differ 642 depending on one's morals. The issue might be exacerbated given the presence of 643 questionable sexual behaviors at the center of many concerns. On one side of the debate, 644 Kavanaugh's Supreme Court tenure presents a prime opportunity to bring morality back into 645 interpretation of the Constitution. Kavanaugh's confirmation creates a conservative stronghold among the justices on the court. Commentators have noted this might help 647 advance a judicial agenda that backpedals certain rights previously upheld by the Supreme 648 Court, including abortion and gay marriage - social issues challenged by their opponents at 649 least partially on moral grounds. Concerns around abortion might be related either to harm/care or purity/sanctity. On the other side of the debate, the assault allegations have energized Kavanaugh's opponents to advocate for his rejection from the court owing to 652 misdeeds resulting from Kavanaugh's own alleged lack of morals. Likewise, arguments could 653 be made that relate concerns regarding sexual violence to harm/care or fairness/reciprocity. 654 Additionally, the moral duty of the Senate as the upper chamber in the U.S. legislature has 655

been scrutinized in public discourse with respect to its handling of the assault allegations
 vis-a-vis Kavanaugh's confirmation.

## U.S. Government Shutdown of 2018-2019

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The U.S. Federal Government partially shut down on December 22, 2018. The 659 government reopened on January 25, 2019 upon the passage of an appropriations bill by 660 both houses of Congress (Axelrod, 2019). The shutdown stemmed from a disagreement 661 between President Donald Trump and Congress over funding for the president's proposed 662 U.S.-Mexico border wall. President Trump demanded \$5.7 billion dollars in the new budget 663 to be appropriated for the wall, which Congress did not provide in its budget (Peoples & 664 Swanson, 2019). Owing to the lack of funding, the government began a partial shutdown, causing "around 800,000" federal employees to be either furloughed or compelled to work 666 without pay (Axelrod, 2019).

The government shutdown ended 35 days later when Congress passed a continuing 668 resolution to fund the government for three weeks while further negotiations regarding the 669 budget would take place. President Trump signed the bill, ending the longest government 670 shutdown in U.S. history (Axelrod, 2019). Many political commentators cite the mounting 671 pressure on Trump and Congress stemming from significant costs both to unpaid American 672 workers and the economy as a whole (Kheel & Mitchell, 2019). Perhaps owing to the 673 financial pressures experienced by thousands of federal employees and their families as a 674 result of a political quarrel, President Trump saw his approval rating fall as the shutdown 675 progressed (Peoples & Swanson, 2019). While the shutdown and its associated burdens were 676 unpopular, the issues discussed concurrent to the shutdown offer the potential for more 677 divergent opinions. 678

As mentioned before, the shutdown started as a result of an impasse regarding funding

for the border wall. Since the wall was proposed during the 2016 presidential campaign, the issue has taken on a moral dimension. As an example, Shaun Casey, the director of 681 Georgetown University's Berkely Center for Religion, Peace and World Affairs, cites 682 diverging opinions stemming from theological concerns (Martin, 2019). Some supporters. 683 citing certain passages from the Bible, believe construction of the wall is part of a divinely 684 ordained process handed down by God. Opponents, on the other hand, have cited other 685 parts of the Bible extolling the significance of exiled peoples, especially the Hebrew people 686 (Martin, 2019). This example potentially ties into the five moral foundations. Theological 687 concerns regarding the border wall might invoke authority/respect as well as purity/sanctity. 688 In addition to these two foundations, the involvement of foreign countries and their citizens' 689 migration into the U.S. could also elicit moral concerns related to ingroup/outgroup.

Owing to the wealth of moral opinions regarding the border wall and its association with the 2018-2019 government shutdown, the researchers decided to add the government shutdown as a news event to analyze under the auspices of Moral Foundations Theory. In addition to articles related to the Kavanaugh confirmation hearing, the researchers scraped articles related to the government shutdown in order to analyze their content for valence and moral alignment.

Method

In contrast to Experiment 1, the researchers approached Experiment 2 with the intention to confirm the method employed was valid for the analysis of the scraped text as well as for any inferences drawn from the analyses. For Experiment 2, the researchers hypothesized that news sources perceived as liberal will exhibit positive endorsements of the individualizing moral foundations (harm/care and fairness/reciprocity) in their articles reporting on both the Kavanaugh confirmation hearing as well as the 2018-2019 government shutdown. News sources perceived as conservative are hypothesized to positively endorse all

five foundations equally in their coverage of the Kavanaugh hearing and the government 705 shutdown. The researchers tested the hypothesis by analyzing the content scraped from news 706 sources' web pages spanning the two weeks before (September 13, 2018) and two weeks after 707 (October 11, 2018) Kavanaugh's confirmation hearing, owing to its prominence in the news. 708 Likewise, the researchers analyzed content spanning two weeks before the start of the 700 government shutdown (December 8, 2018) to two weeks following the end of the shutdown 710 (February 8, 2019). The content will be analyzed for valence and moral alignment under 711 Moral Foundations Theory. Once again, no human participants were needed for this study, 712 so no Institutional Review Board approval was necessary. 713

#### 714 Sources

Articles pertaining to the Brett Kavanaugh Supreme Court nomination and 715 confirmation were scraped from the websites of 12 U.S. news sources. As in Experiment 1, 716 these sources were selected owing to their favorability among political partisans according to 717 Mitchell et al. (2014). The sources favored by the highest proportion of consistent liberals 718 were The New York Times, National Public Radio (NPR), Slate, Huffington Post, and 719 Politico (Mitchell et al., 2014). The sources favored by the highest proportion of consistent 720 conservatives included Fox News, Breitbart, The Rush Limbaugh Show, The Blaze, and Sean Hannity. Political articles referencing Brett Kavanaugh's nomination process were identified and subsequently scraped by including the URL for each source's coverage of the nomination 723 in the R script. All code for this manuscript can be found at https://osf.io/5kpj7/, and the 724 scripts, again written with the papaja library in R, are provided inline with this manuscript 725 (Aust & Barth, 2017). 726

#### 727 Materials

Using the rvest library in the statistical package R, we pulled body text for individual 728 articles from each of the aforementioned 10 news sources (identified using CSS language). 729 We compiled the articles into a dataset (Wickham, 2016). Using this dataset, we identified 730 word count and average word count per source. This process was run for articles pertaining 731 to Kavanaugh's nomination that were published between September 13, 2018 and October 732 11, 2018 inclusive. This date range was selected in reference to the widely-publicized and 733 viewed nomination hearing on September 27, 2018. We set the start date at September 13 (two weeks before the hearing) and the end date at October 11 (two weeks after the hearing) so that we could capture a large amount of data (roughly one month) during which Kavanaugh's nomination was at its peak saturation in news coverage. 737

The same process was followed for scraping articles related to the partial U.S.

Government shutdown of 2018-2019. The articles scraped were published between December

8, 2018 and February 8, 2019 inclusive. Once again, the researchers elected to scrape articles

published two weeks before and after the event in question in order to capitalize on the

shutdown's saturation in American news media.

## 743 Data analysis

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As in Experiment 1, the text was scanned with *ngram*. Again, blank articles, text from the Disqus system, and duplicate articles were removed (Schmidt et al., 2017). The text was processed and stemmed in order to convert to a usable form for further analysis (Feinerer & Hornik, 2017). Words were subsequently matched with their valences from Warriner et al. (2013). Depending on the results of Jordan et al. (2019)'s research, alternative forms of the Moral Foundations Dictionary may be imported instead of the original dictionary.

Using the tm and ngram packages in R, the researchers processed the text in order to

convert it to lowercase, fix spacing anomalies, and remove punctuation (Feinerer & Hornik, 751 2017). Each individual word was reduced to its stem (i.e., diseased was stemmed to diseas). 752 Once again, the same procedure was applied to the MFD words and the words in the 753 Warriner et al. (2013) dataset. Using the Warriner et al. (2013) dictionary, the words in the 754 MFD were assigned their respective valence. The researchers obtained the words' percent 755 occurrence in the text. Once again, percents were multiplied by z-scored valence and 756 categorized into their proper MFD category. 757

Results 758

# **Descriptive Statistics**

The researchers calculated descriptive statistics for each news source per topic in order 760 to reveal the presence (if any) of linguistic differences in the sources' use of language. As in 761 Experiment 1, statistics calculated include z-scored valence, number of articles per source, 762 total words per source, mean tokens per article in each source, mean types per article in each 763 source, and mean readability level (using the Flesch-Kincaid Grade Level Readability 764 formula) per source (Kincaid et al., 1975). 765

Table 3 displays the descriptive statistics for sources' writing on the Kavanaugh 766 confirmation hearing. The sources were similar in most basic linguistic aspects, except for 767 number of articles. For example, The Huffington Post appears to have published only 27 768 articles while NPR published 757 articles on this topic. Valence was found to be slightly positive across all sources. Slate produced the most total words with the most tokens on average. Rush Limbaugh featured the highest number of types on average. The Blaze was the most readable source on average by grade level while Fox News was the least readable. The standard deviations for these statistics, however, preclude conclusions regarding 773 differences in the sources' use of language.

Table 4 displays descriptive statistics for articles about the partial government 775 shutdown. Like the Kavanaugh hearing, the sources were similar in average valence (slightly 776 positive). Once again, there was variation in the number of articles published by each source 777 on this topic. The Hugginton Post and The Blaze published fewer than 100 articles while 778 Slate published 1,013 articles. Slate again featured the most total words and mean tokens. 779 Rush Limbaugh again had the most types on average. For this topic, Slate was the most 780 readable while The Huffington Post was the least readable. For each statistic, the standard 781 deviations render any assertions regarding linguistic differences inconclusive on a descriptive 782 level. 783

### 784 Inferential Statistics

To analyze if news sources adhered to differences in word use based on their target 785 audience, the researchers utilized a multilevel model (MLM) to analyze if news sources 786 leveraged different vocabularies based on target audience. Once again, the researchers used 787 the nlme library in R (Pinheiro et al., 2017). Each foundation's weighted percentage was 788 predicted by the source's political lean, using the individual source as a random intercept to 789 control for the nested data structure. MLMs were constructed from datasets compiled for 790 both topics of interest: the Kavanaugh hearing and the partial government shutdown of 791 2018-2019. 792

For the Kavanaugh topic, the multilevel model indicated the presence of a significant effect for harm/care, but the practical effect denoted by Cohen's d was found to be small. There were no other significant or practical effect of political lean for any of the other four moral foundations. The effect for harm/care was in the hypothesized direction with liberal sources tending to use more positively harm/care words than conservative sources.

Descriptive and test statistics, p-values and effect sizes (Cohen's d) can be found in Table 5.

For news articles about the partial U.S. Federal Government Shutdown of 2018-2019, 799 there were no significant or practical effects of political lean for the moral foundations. A 800 small-to-medium effect size was observed for authority/respect. The effect was in the 801 predicted direction as well, as conservative sources tended to offer more positive 802 endorsements of the foundation than liberal sources. This effect was similar to Experiment 1 803 in which the largest effect size was observed for authority/respect. As noted before, the effect 804 found in Experiment 1 was in the opposite direction as what was hypothesized. Thus, it is 805 difficult to draw comparisons between the two studies despite the similar pattern for effect 806 size. Owing to a lack of similar effects for either Experiment 1 or the Kavanaugh topic, there 807 is doubt as to whether or not a practical or generalized effect exists for authority/respect.

Based on the weighted percent values for the five foundations applied to both topics, MFD words seem to make up little of the article text. A similar pattern was observed for the results in Experiment 1. As in Experiment 1, the percentages and means seem to indicate a generally positive endorsement of all five moral foundations across both political leanings.

Discussion

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The results obtained in Experiment 2 did not confirm either of the hypotheses. The 814 researchers found little compelling evidence of an effect of partisan lean on MFD 815 endorsement. The only significant effect was found for harm/care in the Kavanaugh 816 confirmation hearing dataset. While the effect was in the hypothesized direction (higher positive endorsement for liberal sources), the effect size was small. While there were no 818 significant effects found for the government shutdown topic, a small-to-medium effect size 819 was calculated for the authority/respect foundation. Once again, the effect was in the 820 hypothesized direction with conservative sources providing higher positive endorsements of 821 the foundation relative to liberal sources.

Both of these effects are consistent with both the research hypotheses as well as
previous findings in Moral Foundations Theory scholarship. It should be noted these effects
were found in isolation, and similar patterns were not found across the other studies. These
findings undermine any inferences of political bias stemming from the content of news articles.
The results obtained for Experiment 2 call into question the Moral Foundations Dictionary's
efficacy as a tool for establishing differences between political news sources by partisan lean.

829 Conclusions

Within the theoretical framework of Moral Foundations Theory (Haidt & Graham, 830 2007), the researchers attempted to devise a method leveraging the Moral Foundations 831 Dictionary (Graham et al., 2009) in order to quantify political bias stemming from content 832 published by several prominent American news sources. This method was carried out in 833 several parts. First, the researchers collected the articles through web scraping techniques in 834 R (Wickham, 2016). Second, the text was processed using ngram and tm in R to render it in 835 a form conducive to computerized statistical analysis (Feinerer & Hornik, 2017). Third, 836 percent occurrence of words in the Moral Foundations Dictionary (MFD) was calculated on 837 each source in order to establish how often words indicating endorsement of the five moral 838 foundations appeared. Frequency of MFD word occurrence per article was weighted for 839 valence by multiplying the scores by mean z-scored valence ratings from Warriner et al. 840 (2013). Finally, the researchers constructed multi-level models using nlme in R (Pinheiro et 841 al., 2017) for each foundation in which weighted percentages were predicted by each source's political lean. Individual source was held as a random intercept to control for correlated error. This process was undertaken once in Experiment 1 for general political news and twice in Experiment 2 using articles pertaining to two specific topics in American news: Brett Kavanaugh's confirmation to the Supreme Court and the most recent (as of this writing) 846 partial U.S. Government shutdown from December 2018 to January 2019.

In Experiment 1, the researchers analyzed general political news articles from four 848 prominent U.S. news sources: The New York Times, NPR, Fox News, and Breitbart. They 849 hypothesized The New York Times and NPR would endorse moral foundations 850 representative of liberal political views and that Fox News and Breitbart would endorse 851 foundations indicative of conservative views. The researchers assigned a political lean (liberal 852 or conservative) to the sources based upon consumer preferences established by Mitchell et 853 al. (2014). After collecting the articles through web scraping, processing the article text, 854 calculating percent occurrence of MFD words, and weighting that value by valence, the 855 researchers constructed the MLM. The results obtained were not significant in any statistical 856 or practical sense. There was a small effect found for the authority/respect foundation 857 according to Cohen's d, but the effect suggested endorsement for that foundation opposite to 858 what was hypothesized. The researchers viewed these results as an opportunity to alter their method for use in Experiment 2.

In Experiment 2, the researchers adjusted their method in order to increase their 861 potential ability to quantify political bias in U.S. news sources. First, the researchers 862 expanded the number of news sources from which articles were collected. They added *Slate*, 863 Politico, and Huffington Post to the list of liberal sources and The Blaze, Rush Limbaugh, 864 and Sean Hannity to the conservative sources. Once again, political bias groups were 865 assigned based on Mitchell et al. (2014)'s findings. Second, they elected to collect articles 866 and compile datasets pertaining to two specific topics in U.S. news: the Kavanaugh hearing 867 and the government shutdown. These topics were chosen due to their relevance to multiple 868 moral foundations. Other than those two alterations, the same method (scraping, processing, 860 weighting, and multi-level modelling) was employed for Experiment 2. 870

For articles pertaining to the Kavanaugh hearing, there was a statistically significant effect for *harm/care*, but the effect size was modest. No other statistically or practically significant effects were found for the Kavanaugh topic. Likewise, there were no statistically

or practically significant effects revealed for the government shutdown topic. However, there
was a small-to-medium effect size for *authority/respect*. The fact these patterns do not
appear in any of the other studies undertaken herein decreases the researchers' ability to
draw any valuable conclusions regarding the MFD's ability to reveal political bias in
American news media.

The results obtained in both experiments, while not confirmatory, provide several 879 avenues for future investigation. Twice confronted with the failure to uncover differences in 880 news media's political content, the researchers were unable to confirm the existence of political bias in American news under the auspices of Moral Foundations Theory. This does not, however, rule out the possibility that news media is biased. As Mitchell et al. (2014) has demonstrated, self-reported political partisans are drawn to separate sources, but the 884 present research was unable to offer any content-based explanations of this phenomenon. 885 Even when attenuating the scraping criteria to collect text concerning (what the researchers 886 believed to be) morally resonant topics, the method failed to detect differences in MFD word 887 use by prominent news sources. The researchers' focus, therefore, turns toward the 888 limitations of the method, especially the chosen theoretical framework, under which the 889 present research was conducted. 890

Despite the fact the results regarding political bias were inconclusive, the researchers still retain confidence in the overall structure of the methodology established in the current study. Specifically, the procedure for scraping text from the web, processing, stemming, and weighting the scores with valence seems to represent a solid method for preparing a high quantity of text passages for data analysis. The researchers implemented valence as an indicator of the directionality of endorsement due to the inherent ambiguity of simply calculating MFD word percent occurrence. Additionally, multi-level models were necessary to control for the nested nature of the data where political lean encompassed several sources, which themselves encompassed numerous articles.

Thus, the researchers' attention turned to the instrument used to detect differences. In
the present study, the researchers utilized the Moral Foundations Dictionary, a metric
developed from Moral Foundations Theory (Graham et al., 2009). Based upon the results
obtained, it might be necessary to investigate alternative instruments that might better
elucidate the differences of interest. Likewise, other theoretical perspectives may be better
equipped to explain political differences in discourse.

Tools such as these could be developed through the Linguistic Inquiry and Word Count 906 program (LIWC) (Pennebaker et al., 2007). As stated before, the Moral Foundations 907 Dictionary was established through an analysis of Christian sermons performed mostly with 908 LIWC as well as some human-enforced corrections due to context (Graham et al., 2009). 900 This approach was grounded in Moral Foundations Theory, a clear framework within which 910 the authors developed the MFD. The authors established sound psychometric properties for 911 the tool, implying its validity in several applications. For this reason, the researchers elected 912 to utilize the MFD as their primary instrument. 913

Other instruments could theoretically be developed through a LIWC analysis,
including those that would be useful for analyzing political discourse. Researchers could
obtain percent occurrence scores for words appearing in certain LIWC categories, which
could then be weighted with valence scores from Warriner et al. (2013). The researchers will
consider other applications of the LIWC in future studies aiming to analyze political content.
However, without a firm theoretical foundation for such analyses, any such applications of
LIWC would face serious questions as to their relevance, validity, and generalizability.
Nevertheless, LIWC analyses may represent a path to further research into political
differences in news media as well as theory formation.

There is, however, another theoretical framework that could prove useful when applied to the method established in the present research. Relational Frame Theory originates in applied behavior analysis, but there exists recent scholarship that demonstrates its potential

usefulness in the political realm. Relational Frame Theory (RFT) holds that stimuli, including speech and discourse, elicit responses in terms of relationships to other stimuli, 927 even when the stimuli do not otherwise appear to be related (Blackledge, 2014). For example, 928 an individual's equivalent fear response to a venomous snake as well as a wooded area said to 929 "contain snakes" represents "mutual entailment." That is, the fear response is an effect of 930 both the snake and environment stimuli, which cause the fear response. "Combinatorial 931 entailment" can be represented by a fear response elicited by a novel stimulus whose 932 relationship to a well-known stimulus elicits a certain response (Blackledge, 2014). In the 933 snake example, if another stimulus (Stimulus A), were said to be "worse than" the snake, the 934 relationship between A and the snake would elicit a more severe fear response to Stimulus A. 935 RFT utilizes a set of "families" describing the nature of these relationships. Such families 936 include "coordinative," establishing similarities between stimuli, and "distinctive," implying fundamental differences between stimuli (Belisle, Paliliunas, Dixon, & Tarbox, 2018). These 938 families can be used to analyze networks of relational frames in discourse.

Belisle et al. (2018) conducted a text analysis (using a computer algorithm) of several 940 speeches made by four recent U.S. presidents under Relational Frame Theory. These 941 speeches, representing prominent examples of political discourse, were found to differ in their 942 use of relational frames. For example, speeches by Donald Trump were found to contain 943 more distinctive frames than other presidents, while Barack Obama utilized more 944 coordinative frames than his counterparts (Belisle et al., 2018). At first glance, the 945 differences appear to fall along party lines, though other factors may be involved as well. In 946 any case, this research appears to indicate that RFT might be useful for analyzing political 947 news content similar to the method employed in the current study. 948

Another apparent strength of RFT is its demonstrated effectiveness in the analysis of political discourse. Unlike the development of the Moral Foundations Dictionary, this application of RFT was performed on public facing political discourse that might be more

similar to news articles than the Christian sermons upon which the MFD was compiled. 952 Additionally, there would likely be greater overlap between the speeches analyzed in Belisle 953 et al. (2018)'s work and political news, as the media often quotes speeches by the president. 954 Furthermore, the types or "families" of relational frames could be used as the individual 955 constructs much like the moral foundations in the present research. In order to conform with 956 the method established for this study, their occurrence would need to be scored, probably as 957 a percent. This would allow for an intuitive approach to weighting by z-scored valence if 958 needed. 959

While Relational Frame Theory appears to represent a viable option for further 960 research into political news analysis, there are some drawbacks. First, RFT by itself does not purport to elucidate political differences in discourse, and its applications to political 962 research are not yet well established. One of the main strengths of Moral Foundations 963 Theory in the eyes of the researchers was that it was a theory designed to investigate not 964 only moral differences but also political differences. While the results obtained herein may 965 weaken assumptions regarding the MFD's capabilities with political text, Moral Foundations 966 Theory has been repeatedly established as a strong framework for detecting political 967 differences along moral lines. 968

In order to seriously consider RFT as a viable framework for this type of analysis, the researchers would like to be able to draw on further confirmatory evidence of the theory's utility in political discourse analysis. Specifically, analyses of more individuals than the four presidents addressed by Belisle et al. (2018) would be needed to further demonstrate RFT's applicability in this field. Also, though presidential speeches may be more similar to news articles than sermons, they are still a distinct form of discourse with different goals and audiences than news outlets. RFT's reliability across these forms appears to remain untested as of this writing. These potential shortcomings are testable and might be overcome through more research. As such, RFT's potential as a useful framework for political discourse

analysis should not be discounted.

The researchers aimed to utilize the Moral Foundations Dictionary and valence in the 979 analysis of political news articles to determine whether or not bias was present. In 980 Experiment 1, they tested general political news from four U.S. news sources - two liberal 981 and two conservative. They were unable to find any significant evidence of political bias in 982 that analysis. After adjusting the method to include more sources and specific topics for 983 articles, including the Kavanaugh hearing and the government shutdown, the researchers 984 were once again unable to uncover differences in MFD word use between conservative and liberal news sources. The results in the current study seem to demonstrate the MFD's weaknesses in applications to political discourse. MFD words simply might not appear often enough in news articles to register as endorsement for any particular moral foundation over 988 the others. In future research, this weakness could be addressed through further alterations 989 to the method, including alternative analyses using computer programs including LIWC, or 990 through a different theoretical perspective such as Relational Frame Theory. Despite the 991 results obtained in the current study, the researchers have reason to believe this line of 992 inquiry warrants further investigation and that the correct method will one day be 993 established. 994

Never before has news media and discourse represented such fertile ground for ggr psychological research. The plethora of options and the potential for misinformation present 996 important challenges for American democracy in the twenty-first century. The potential 997 divisions in American society resulting from an abundance of choices for sources of political information, coupled with the notion that public discourse seems to offer competing conceptions of objective truth, underscores the importance of research into the content of 1000 political news. Democracy functions effectively on the foundation an informed and engaged 1001 electorate. Therefore, it is incumbent upon social scientists to continue investigating the 1002 information consumed by millions of citizens every day so that insights into the nature and 1003

consequences of political discourse can be more completely understood.

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Table 1  $Experiment \ 1 \ - \ Descriptive \ Statistics \ by \ Source$ 

Source	$M_V$	$SD_V$	$N_{Article}$	$N_{Words}$	$M_T$	$SD_T$	$M_{Ty}$	$SD_{Ty}$	$M_{FK}$	$SD_{FK}$
NPR	0.28	0.23	695	302977	435.94	642.63	191.96	192.29	13.80	3.93
New York Times	0.30	0.13	406	452579	1,114.73	511.86	454.27	154.58	16.32	3.29
Breitbart	0.29	0.18	1437	722022	502.45	347.90	243.36	120.76	18.42	8.01
Fox News	0.29	0.17	503	296779	590.02	528.60	283.57	189.00	16.92	7.16

Note. Readability statistics were calculated using the Flesch-Kincaid Grade Level readability formula. V = Valence, T = Tokens or total words, Ty = Types or unique words, FK = Flesch-Kincaid

Table 2

Foundation	$M_C$	$SD_C$	$M_L$	$SD_L$	t	p	d
Harm/Care	0.50	2.21	0.49	2.21	-0.21	.850	0.01
Fairness/Reciprocity	1.13	1.38	1.11	1.38	-0.42	.715	0.02
Ingroup/Loyalty	1.28	1.63	1.34	1.63	0.30	.789	-0.04
Authority/Respect	0.72	1.62	1.06	1.62	3.17	.087	-0.20
Purity/Sanctity	1.11	1.48	1.27	1.48	2.37	.141	-0.09

 $\it Note.$  For mean and standard deviation values, 'C' and 'L' refer to 'conservative' and 'liberal,' respectively

Table 3  ${\it Kavanaugh - Descriptive Statistics \ by \ Source}$ 

Source	$M_V$	$SD_V$	$N_{Article}$	$N_{Words}$	$M_T$	$SD_T$	$M_{Ty}$	$SD_{Ty}$	$M_{FK}$	$SD_{FK}$
Huffington Post	0.27	0.12	552	359046	650.45	462.21	283.07	129.23	10.79	1.91
NPR	0.22	0.25	366	108605	296.73	499.10	128.12	172.51	12.49	3.62
New York Times	0.33	0.13	653	723569	1,108.07	570.31	461.26	174.20	10.56	2.10
Politico	0.32	0.10	689	1069292	1,551.95	1,045.47	614.66	358.68	12.09	2.60
Slate	0.29	0.12	272	229896	845.21	612.22	332.42	168.17	12.35	2.47
The Blaze	0.25	0.13	277	128097	462.44	149.66	210.52	53.14	10.83	1.87
Breitbart	0.30	0.13	757	375848	496.50	609.91	230.03	153.62	11.01	2.12
Fox News	0.29	0.11	646	1304048	2,018.65	2,709.77	534.47	404.21	9.70	1.85
Sean Hannity	0.31	0.11	27	5926	219.48	145.98	121.04	57.26	11.88	2.37
Rush Limbaugh	0.38	0.13	172	267067	1,552.72	1,258.51	419.00	225.80	9.42	9.26

Note. Readability statistics were calculated using the Flesch-Kincaid Grade Level readability formula. V = Valence, T = Tokens or total words, Ty = Types or unique words, FK = Flesch-Kincaid

 $\label{thm:continuous} \begin{tabular}{ll} Table 4 \\ Government \ Shutdown \ - \ Descriptive \ Statistics \ by \ Source \\ \end{tabular}$ 

Source	$M_V$	$SD_V$	$N_{Article}$	$N_{Words}$	$M_T$	$SD_T$	$M_{Ty}$	$SD_{Ty}$	$M_{FK}$	$SD_{FK}$
Huffington Post	0.30	0.13	432	242220	560.69	425.52	258.27	130.54	10.67	1.83
NPR	0.23	0.22	434	151114	348.19	457.34	155.53	171.30	11.19	3.15
New York Times	0.33	0.13	751	831184	1,106.77	506.92	471.80	174.88	11.28	2.19
Politico	0.29	0.10	222	349499	1,574.32	875.63	638.32	313.34	11.28	1.23
Slate	0.30	0.12	117	85254	728.67	464.34	301.71	138.74	11.86	2.51
The Blaze	0.26	0.13	98	38983	397.79	102.10	185.66	41.93	10.68	1.85
Breitbart	0.34	0.15	309	102886	332.96	238.70	168.31	81.59	10.71	2.05
Fox News	0.35	0.13	1013	2799217	2,763.29	3,405.44	637.30	494.00	9.34	1.91
Sean Hannity	0.29	0.14	63	10311	163.67	33.59	95.13	16.59	13.41	4.79
Rush Limbaugh	0.37	0.12	78	152630	1,956.79	1,544.14	482.79	252.79	9.76	7.60

Note. Readability statistics were calculated using the Flesch-Kincaid Grade Level readability formula. V = Valence, T = Tokens or total words, Ty = Types or unique words, FK = Flesch-Kincaid

Table 5

Foundation	$M_C$	$SD_C$	$M_L$	$SD_L$	t	p	d
Harm/Care	0.39	1.35	0.66	1.35	2.89	.020	-0.19
Fairness/Reciprocity	1.26	1.27	1.06	1.27	-1.58	.154	0.16
Ingroup/Loyalty	1.15	1.22	1.06	1.22	-0.63	.549	0.07
Authority/Respect	0.85	0.99	0.75	0.99	-0.93	.380	0.10
Purity/Sanctity	0.90	1.28	1.06	1.28	0.88	.406	-0.11

 $\it Note.$  For mean and standard deviation values, 'C' and 'L' refer to 'conservative' and 'liberal,' respectively

Table 6

Foundation	$M_C$	$SD_C$	$M_L$	$SD_L$	t	p	d
Harm/Care	0.91	1.27	1.01	1.27	1.68	.132	-0.07
Fairness/Reciprocity	1.22	1.05	0.91	1.05	-0.76	.468	0.27
Ingroup/Loyalty	1.38	1.16	1.11	1.16	-0.48	.644	0.21
Authority/Respect	0.87	1.24	0.36	1.24	-1.38	.203	0.37
Purity/Sanctity	1.29	1.13	0.99	1.13	0.03	.979	0.22

Note. For mean and standard deviation values, 'C' and 'L' refer to 'conservative' and 'liberal,' respectively