## **Towards Figurative Language Generation in Afrikaans**

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**Introduction** This paper presents an LSTMbased approach to figurative language generation, which is an important step towards creative text generation in Afrikaans. Due to scarcity of resources (in comparison to resource-rich languages), we train the proposed network on a single literary novel. This follows the same approach as Van Heerden and Bas (2021), however we explicitly focus and expand on fully automatic text generation, centring on figurative language in particular. The proposed model generates phrases that contain compellingly novel figures of speech such as metaphor, simile and personification.

Afrikaans NLP In  $\forall$  et al. (2020a,b) and Adelani et al. (2021), Masakhane shows that NLP research in African languages is under-represented. This is true for Afrikaans as well. Although some studies (Van Zaanen and Van Huyssteen, 2003; Sanby et al., 2016; Ziering and Van der Plas, 2016; Dirix et al., 2017) and datasets (Eiselen and Puttkammer, 2014; Augustinus et al., 2016; Roux, 2016) are available, text generation in Afrikaans is very limited.

**Related Work** Studies in figurative text generation include simile (Harmon, 2015; Chakrabarty et al., 2020), slogan (Alnajjar et al., 2018) and metaphor (Gero and Chilton, 2019; Brooks and Youssef, 2020; Chakrabarty et al., 2021) generation. These computational approaches involve style transfer and word masking but also, more traditionally, non-computational theories of metaphor creation, e.g. the tenor-vehicle model (Richards, 1936). Moreover, related work on figurative language (including the aforementioned) tends to focus on English and other resource-rich languages, using knowledge bases, graphs, pretrained networks and datasets.

**Model** We use a two-layer vanilla LSTM architecture (Hochreiter and Schmidhuber, 1997). The proposed model consists of two LSTM layers with

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dropout layers, a fully connected layer and a softmax layer. The network trained on the South African novel *Die Biblioteek aan die Einde van die Wêreld (The Library at the End of the World)* (Van Heerden, 2019). The book consists of approximately 210K words and is well suited to the task given its near-poetic use of figurative language and imagery.

**Approach** Instead of following relational rules and constraining the model, we adopt Black's interaction theory of metaphor (1962). This is relevant to the study given its emphasis on the generative function of figurative language. In this view, meaning is not static; metaphor does not draw on pre-existing likeness but instead creates new, often surprising, likeness between concepts (Indurkhya, 1992; Veale et al., 2016). Through metaphor, dissimilar domains interact, giving rise to novel connections and perspectives (Way, 1991). It is challenging to measure originality in generated text (Klebanov and Madnani, 2020). However, if figurative meaning does in fact rely on "mismatch" between domains (Fogelin, 2011), one might argue: the greater the mismatch, the greater the novelty.

**Results** Table 1 provides examples of generated phrases and sentences containing figures of speech such as metaphor and personification. (Note that punctuation and capitalisation were removed in some instances.) We did not set out to generate figurative language per se, meaning that there are no specific components to enforce rules or constraints on the model. Similar to the trained data, the network outputs unique descriptive formulations. Given our interest in creative text generation, we believe that the success of the results is not determined by the amount of similarities shared between referents, as explained by Giles et al. (1991). Instead, we prioritise unexpected associations between disparate concepts, e.g. "democracy" as a "roof garden" (See Table 1, line 19).

Original (Afrikaans)	Translation (English)
ons biblioteek by die werkwoord gekaap	our library hijacked at the verb
die wêreld sê ek met boeke	the world I say with books
wêreldletterkunde in armoede	world literature in poverty
saggies soos 'n spokerigheid	softly like a ghostliness
in die vlug van papier	in the flight of paper
sy vingers draai om haar gevoel	his fingers wrap around her feeling
ek het 'n gloeiende noordgrens	I have a glowing northern border
woede is jou mond	anger is your mouth
brand my in die oggendlug	burn me in the morning air
die wind stoppelbaard vorentoe	the wind stubbles forth
sy kyk verras op, sy oë verlate	she looks up in surprise, his eyes deserted
verandering speel as foto's van die wind	change plays as photos of the wind
die petrolbomme wat nie vertel nie	the petrol bombs that do not tell
sukkel is hulle kuns	struggling is their art
onbeskermde skittering in die woord	unprotected brightness in the word
my rug se wit greep	my back's white grip
ek is geld want niks kan bloei nie	I am money because nothing can bleed
aarselend weerskante van die staar	hesitant on either side of the stare
demokrasie was 'n daktuin	democracy was a roof garden
begin die sonsopkoms voor die dak van my gesig	begins the sunrise before the roof of my face
jou uitgespoel is 'n onderstebo losgewoel	your rinsed-out is an upside-down tossed-loose
gesprekke vir die oomblik skoongeskraap bleek	conversations momentarily clean-scraped pale
lewe in hierdie nuwe hande waar ek algoritmies kuier	life in these new hands where I socialise algorithmically

Table 1: Example results of figurative language generation. The translations might not do justice to the original given the distinctiveness of some of the formulations as well as the compounding nature of Afrikaans.

**Discussion** Defined as "language that is more expressive and/or poetic than referential in its linguistic function" (Chandler and Munday, 2011), figurative language comprises metaphor, simile, personification and various other figures of speech. It is a vital resource of creative writing (Baldick, 1996) often associated with originality. In fact, original metaphor is considered "the controlling element in all creative language" (Newmark, 1988). Because it is open to interpretation, metaphorical language invites the reader to participate in the process of meaning-making (White, 1996), thus facilitating connection between reader and text (Cohen, 1978). Compared to metaphors in everyday speech, unusual and unexpected figures stand out (Kovecses, 2010) and, in a literary context, capture readers' attention (Steen, 1994). Furthermore, Gibbs et al. suggest that original metaphors "communicate more emotional intensity than conventional metaphor" (2002). Therefore, novel metaphor is not only related to creativity but also to emotion (Fainsilber and Ortony, 1987; Fussell and Moss, 1998). Future work could explore how this may lend emotional depth to generated text.

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