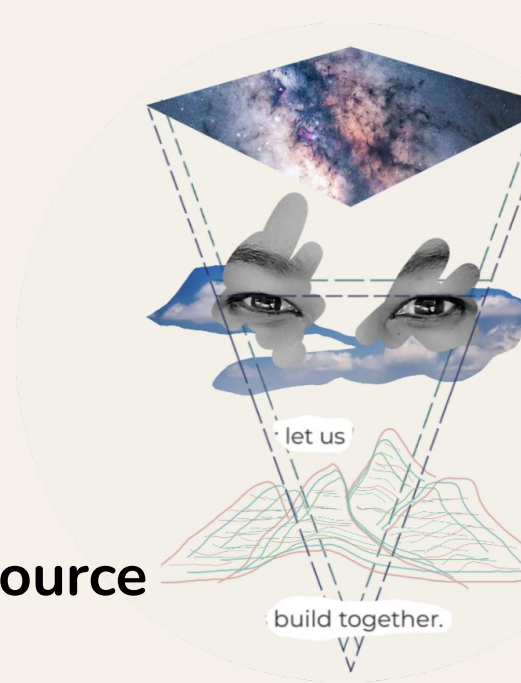


# Transforming Africa

## How we created a hub for low-resource languages



Presented By  
Orevaoghene Ahia | Chris Emezue  
For MASAKHANE

Open “NLP” Workshop 2021

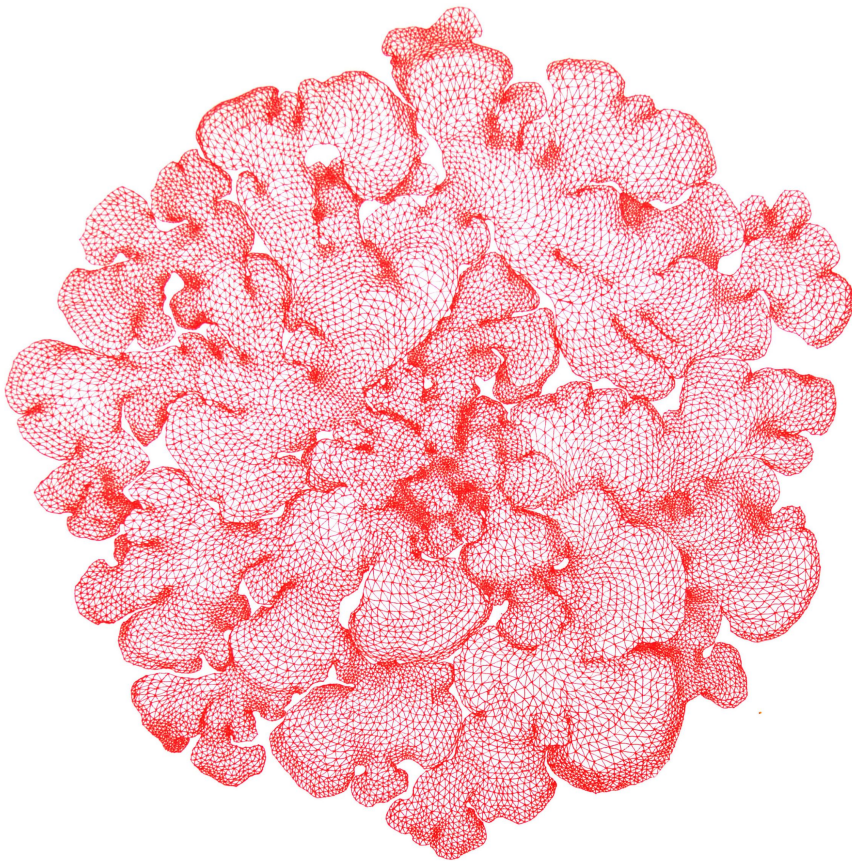
# Outline

- Introduction
- State of NLP in Africa before Masakhane
- How we are bridging the gap ?
- Success story
- Ongoing projects

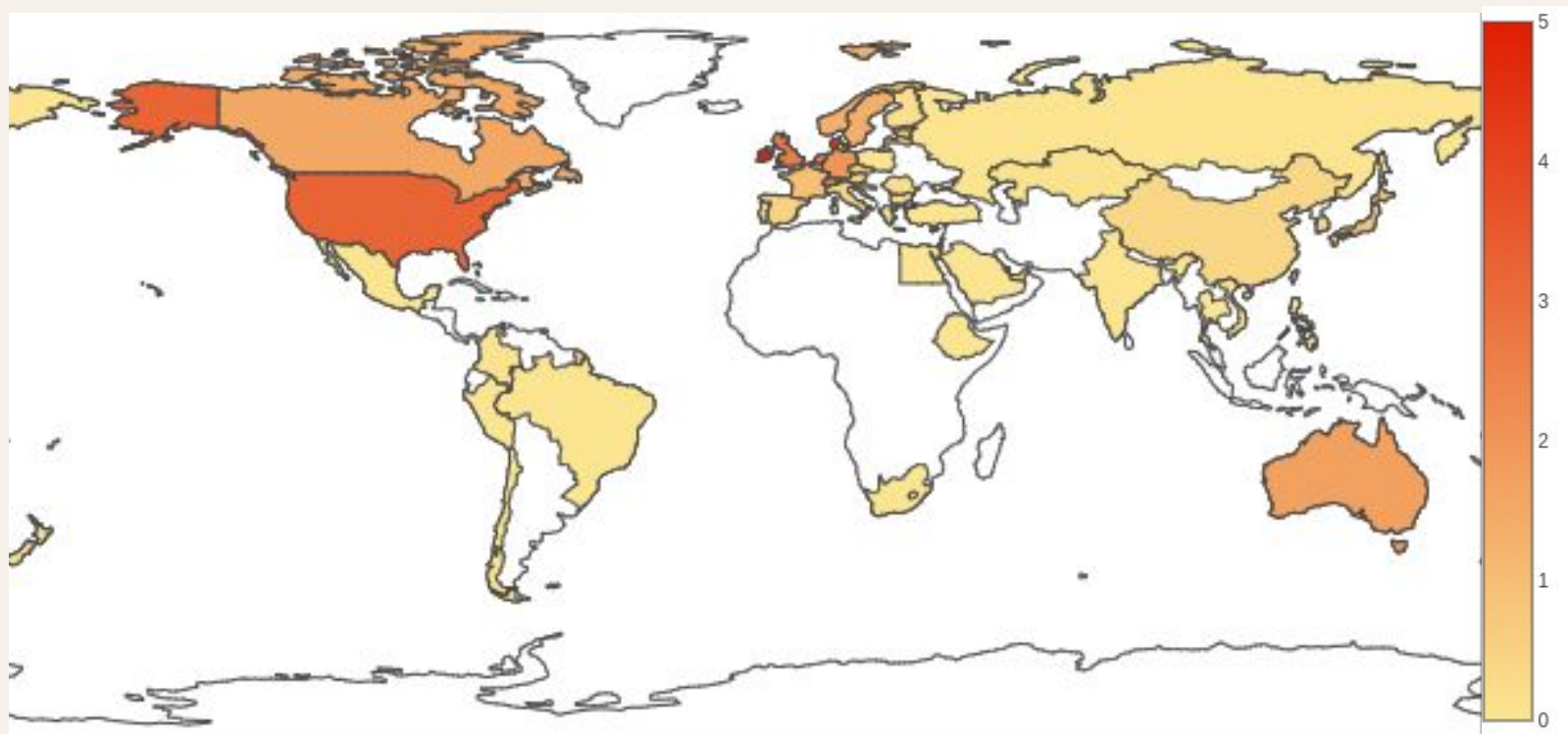
## Low-resourcedness

Language	Articles	Speakers	Category
English	6,087,118	1,268,100,000	Winner
Egyptian Arabic	573,355	64,600,000	Hopeful
Afrikaans	91,002	17,500,000	Rising Star
Kiswahili	59,038	98,300,000	Rising Star
Yoruba	32,572	39,800,000	Rising Star
Shona	5,505	9,000,000	Scraping by
Zulu	2,219	27,800,000	Hopeful
Igbo	1,487	27,000,000	Scraping by
Luo	0	4,200,000	Left-behind
Fon	0	2,200,000	Left-behind
Dendi	0	257,000	Left-behind
Damara	0	200,000	Left-behind

Table 1: Sizes of a subset of African language Wikipedias<sup>1</sup>, speaker populations<sup>2</sup>, and categories according to [Joshi et al. \(2020\)](#) (28 May 2020).



Artwork by [Keneilwe Mokoena](#)



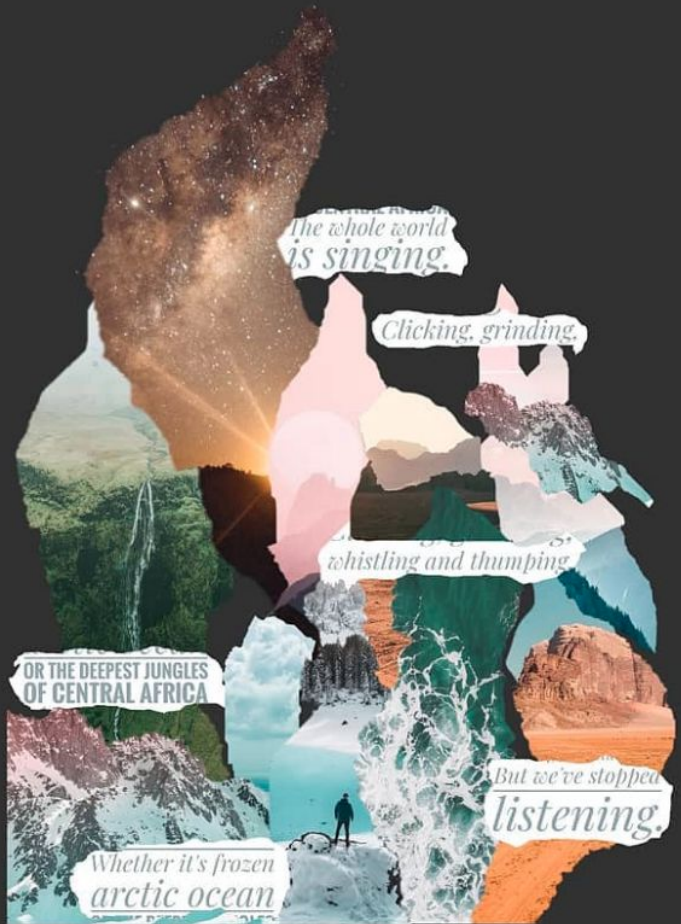
Normalized paper count by country at the 2018 NLP conferences ([Caines, 2019](#))

**30% of all living  
languages today are  
African languages**  
(Ethnologue)



Artwork by Keneilwe Mokoena





**In all ACL conferences  
in 2018, only 0.1% of  
author affiliations were  
based in Africa**

(Caines, 2019)

Artwork by Keneilwe Mokoena

# Reflection





"The effect of a **cultural bomb** is to **annihilate a people's belief** in their names, in their languages, in their environment, in their heritage of struggle, in their unity, in their capacities and ultimately in themselves."

Ngũgĩ wa Thiong'o ~ Decolonising the Mind

Artwork by [Keneilwe Mokoena](#)



“Low-resourcedness”  
is about more than  
just data  
- it’s societal





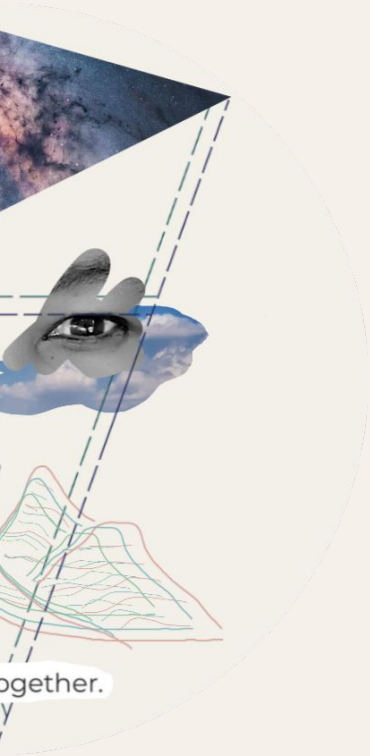
**We Are**  
the effort for NLP for African  
languages that is

**OPEN SOURCE**  
**CONTINENT-WIDE**  
**DISTRIBUTED**  
**ONLINE**

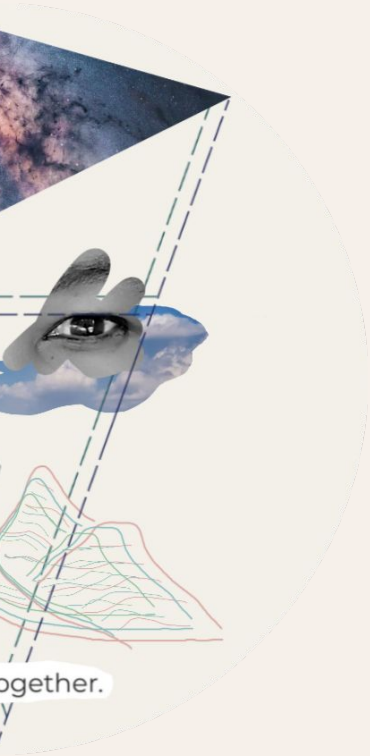
“Look Within” by Reggie Khumalo

# Case Study: **Masakhane**

## **#OurStory**



# Participatory Research as a means to ensure everyone who should be in the room is in the room



# Goals

## For Africa

To build a community of NLP researchers, connect and grow it, spurring and sharing further research, to enable language preservation, tool building and increase its global visibility and relevance



Artwork by Keneilwe Mokoena



## Goals

# For research communities

To discover best practices for distributed research, to be applied by other emerging research communities.



**#OurMethod**



Artwork by Keneilwe Mokoena

## 1. How to find participants?

- *locally*: Indaba Deep Learning school, meetups, universities
- *remotely*: Twitter, conferences, press coverage, publications
- no academic prerequisites

## 2. How to assign roles? (agents)

- no fixed roles
- cross-functional collaboration
- adapt to interest and skills
- focus on knowledge transfer & sharing
  - from mentee to mentor

### 3. How to connect the distributed participants?

- Open digital communication channels
  - Active [slack workspace](#) & [Google group](#)
  - Weekly virtual meetings
  - Virtual reading group
- Making findings *accessible*
  - Public meeting notes
  - All results, models and code published for each submission
  - Data shared on GitHub
- Anyone can make calls for collaboration
  - *emerging* rather than imposed agendas



Artwork by [Keneilwe Mokoena](#)



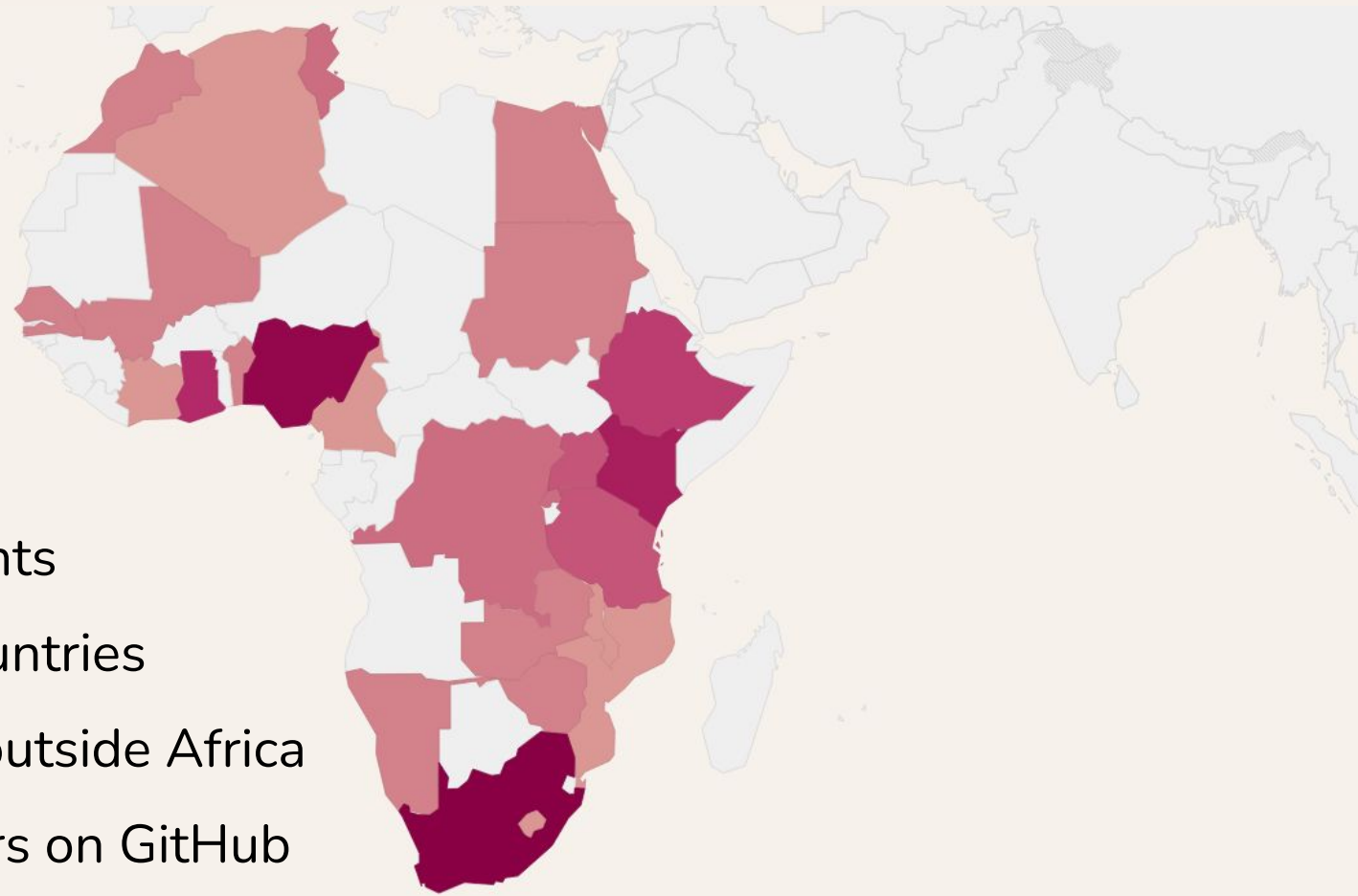
Artwork by Keneilwe Mokoena

## 4. How to lower participation barriers?

- a guided *hands-on* experience to get started
  - making use of *freely* available resources
    - data: [JW300](#) (Agić+, 2019) includes 101 African languages
    - code: [JoeyNMT](#) (Kreutzer+, 2019) 🐻
    - compute: Google Colab
- beginner friendly [Jupyter notebook](#) to prepare data, train and evaluate MT models
- [tutorials](#) & [guidelines](#)

**#OurCommunity**

- 480 participants
- 30 African countries
- >3 countries outside Africa
- 34 contributors on GitHub





**87% of participants found mentors of  
collaborators**

## Publications 2020 & 2021

▽, Masakhane:

- [EMNLP Findings 2020](#)
- [AfricaNLP 2020](#)
- [AfricanNLP2021: MasakhaNER](#)
- [AFricanNLP2021: Quality at a Glance](#)

13+ more papers:

- [NMT for Fon-French](#), [Edoid languages](#), [Nigerian Tigrinya](#), [Hausa](#), [South African languages](#)
- [Dataset creation for Setswana & Sepedi](#)
- [Transformer depth](#)
- [Law-Making in Kenya](#)
- [AI4D: Dataset challenges](#)
- [Text classification for Kinyarwanda & Kirundi](#)
- [Diacriticization for Yorùbá](#)

Full [list](#)



Artwork by [Keneilwe Mokoena](#)

# **2021 Wikimedia Foundation Research Award of the Year**

# Best Paper Award @ AfricaNLP 2021

## MasakhaNER - Named Entity Recognition for African Languages

MasakhaNER: Named Entity Recognition for African Languages

David Ifeoluwa Adelani<sup>1\*</sup>, Jade Abbott<sup>2\*</sup>, Graham Neubig<sup>3</sup>, Daniel D'souza<sup>4\*</sup>,  
Julia Kreutzer<sup>5\*</sup>, Constantine Lignos<sup>6\*</sup>, Chester Palen-Michel<sup>7\*</sup>, Happy Buzaaba<sup>7\*</sup>,  
Shruti Rijhwani<sup>3</sup>, Sebastian Ruder<sup>8</sup>, Stephen Mayhew<sup>9</sup>, Israel Abebe Azime<sup>10\*</sup>,  
Shamsuddeen H. Muhammad<sup>11,12\*</sup>, Chris Chinenye Emezue<sup>13\*</sup>, Joyce Nakatumba-Nabende<sup>14\*</sup>,  
Perez Ogayo<sup>15\*</sup>, Anuoluwapo Aremu<sup>16\*</sup>, Catherine Gitau<sup>\*</sup>, Derguene Mbaye<sup>\*</sup>,  
Jesujoba Alabi<sup>17\*</sup>, Seid Muhie Yimam<sup>18</sup>, Tajuddeen Gwadabe<sup>19\*</sup>, Ignatius Ezeani<sup>20\*</sup>,  
Rubungo Andre Niyongabo<sup>21\*</sup>, Jonathan Mukibi<sup>14</sup>, Verrah Otiende<sup>22\*</sup>,  
Irero Orife<sup>23\*</sup>, Davis David<sup>\*</sup>, Samba Ngom<sup>\*</sup>, Tosin Adewumi<sup>24\*</sup>,  
Paul Rayson<sup>25</sup>, Mofetoluwa Adeyemi<sup>\*</sup>, Gerald Muriuki<sup>14</sup>, Emmanuel Anebi<sup>\*</sup>,  
Chiamaka Chukwunke<sup>26</sup>, Nkiruka Odu<sup>25</sup>, Eric Peter Wairagala<sup>14</sup>,  
Samuel Oyerinde<sup>\*</sup>, Clemencia Siro<sup>\*</sup>, Tobias Saul Batesa<sup>14</sup>, Temilola Oloyede<sup>\*</sup>,  
Yvonne Wambui<sup>\*</sup>, Victor Akinode<sup>\*</sup>, Deborah Nabagereka<sup>14</sup>, Maurice Katusiime<sup>14</sup>,  
Ayodele Awokoya<sup>26\*</sup>, Mouhamadane MBOUP<sup>\*</sup>, Dibora Gebreyohannes<sup>\*</sup>, Henok T<sup>14</sup>,  
Kelechi Nwaike<sup>\*</sup>, Degaga Wolde<sup>\*</sup>, Abdoulaye Faye<sup>\*</sup>, Blessing Sibanda<sup>27\*</sup>,  
Orevaoghene Abia<sup>28\*</sup>, Bonaventure F. P. Dossou<sup>29\*</sup>, Kelechi Ogueji<sup>30\*</sup>,  
Thierno Ibrahima DIOP<sup>\*</sup>, Abdoulaye Diallo<sup>\*</sup>, Adewale Akinfaderin<sup>\*</sup>,  
Tendai Marengereke<sup>\*</sup>, and Salomey Osei<sup>10\*</sup>

- *Proposes a NER resource for 10 african languages*
- *Impact is important*
- *Extensive experiments have been carried out on the dataset*

Language	Sentence
English	The Emir of <b>Kano</b> turbaned <b>Zhang</b> who has spent <b>18 years</b> in <b>Nigeria</b>
Amharic	የካና ኢምር በናይጄር ሩጅ ዓመት የላለፈውን ግንጥ ጥና መሪ አደረጉት
Hausa	Sarkin <b>Kano</b> yayi wa <b>Zhang</b> wanda yayi <b>shekara 18</b> a <b>Nigeria</b> sarauta
Igbo	Onye Emir nke <b>Kano</b> kpubere <b>Zhang</b> okpu onye nke nogoro <b>afọ iri na asato</b> na <b>Najirja</b>
Kinyarwanda	Emir w'i <b>Kano</b> yimitse <b>Zhang</b> wari umaze <b>imyaka 18</b> muri <b>Nigeria</b>
Luganda	Emir w'e <b>Kano</b> yatikkidde <b>Zhang</b> amaze emyaka <b>18</b> mu <b>Nigeria</b>
Luo	Emir mar <b>Kano</b> ne orwakone turban <b>Zhang</b> ma osedak <b>Nigeria</b> kwuom <b>higni 18</b>
Nigerian-Pidgin	Emir of <b>Kano</b> turban <b>Zhang</b> wey don spend <b>18 years</b> for <b>Nigeria</b>
Swahili	Emir wa <b>Kano</b> alimvisha kilemba <b>Zhang</b> ambaye alikaa <b>miaka 18</b> nchini <b>Nigeria</b>
Wolof	Emiiru <b>Kano</b> dafa kaala kii di <b>Zhang</b> mii def <b>Nigeria</b> fukki di ak juroom hett
Yorùbá	Èmià ilú <b>Kànó</b> wé láwani lé orí <b>Zhang</b> eni tí ò tí lo <b>odún méjìdínlógún</b> ní orílẹ̀-èdè <b>Nàìjíríà</b>

# LACUNA FUND Grant Recipients



**Masakhane** @MasakhaneNLP · Apr 28

We're unbelievably excited to announce that 4 of our applications were awarded grants! 🥳🌟 Thank you @LacunaFund

More details to follow 📌



**Lacuna Fund** @LacunaFund · Apr 28

Almost a year after our launch, we are proud to announce our second cohort of projects, whose teams will create openly accessible text and speech datasets fueling #NLP technologies in 29 languages, engaging dozens of institutions across Africa and beyond: [bit.ly/3vqdQiq](https://bit.ly/3vqdQiq)

[Show this thread](#)



Lacuna Fund announces our second round of funding to support datasets for more equitable and accessible AI in language

Read more about the projects at  
<https://lacunafund.org/language-2020-awards/>

# #OurData



When data curators originate from the  
places the languages are spoken



Coffee & Translate Sessions  
for Namibia's  
KhoekhoeGowab Languages

Community Driven Creation  
of Nigerian Language  
Datasets

<https://github.com/masakhane-io/masakhane-khoekhoegowab>

<https://github.com/masakhane-io/masakhane-wazobia-dataset>

### Data Curation for African NER Datasets

<https://github.com/masakhane-io/masakhane-ner>

Opening up existing but  
unpublished public data  
from South African  
Parliament for 11 official  
languages

<https://bit.ly/raw-parliamentary-translations>

Data Collection for Fon Language

<https://github.com/bonaventuredossou/ffr-v1>

**#OurExperiments**

## Our NMT results

- **47+ translation models for 35 African languages** have been published
- Evaluation: post-edits for 9 languages
  - Training on JW300
  - Post-editing for COVID Surveys and TED talks
- **MasakhaneWEB**

Full [list](#)



Artwork by [Keneilwe Mokoena](#)



Artwork by [Keneilwe Mokoena](#)

# Ongoing Initiatives

- Machine Translation models and evaluation for more and more languages
- Data Gathering
- Named Entity Recognition
- Building language models for African languages
- Building tools for people to try out our trained models
- Weekly NLP reading group

## Challenges

- Domain Gap
- **Dialectical** differences impact performance
- Diacritics
- Evaluation
- Ineffective **keyboards**



Artwork by [Keneilwe Mokoena](#)

**#Tools**



## MasakhaneWEB



# Masakhane

Machine translation service for African languages

From: English ▾

To: Swahili ▾


This is a good day

Hii ni siku nzuri

Translate

×

Give Feedback

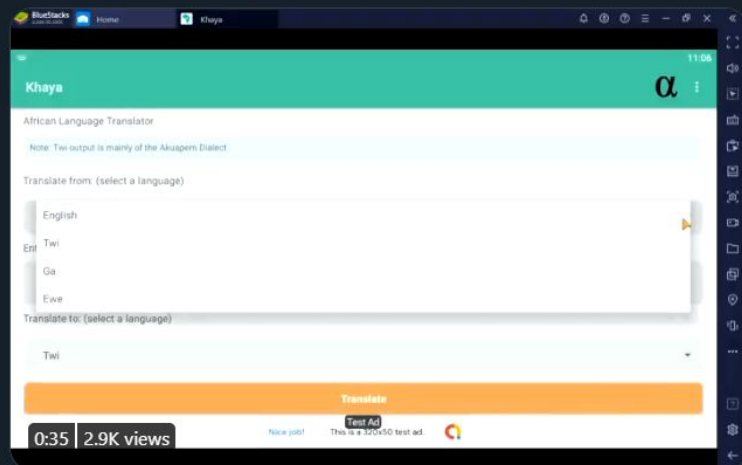


# GhanaNLP



**Ghana Natural Language Processing (NLP)** @Ghana... · Dec 14, 2020

Our Android app for translating Ghanaian languages is up on the Google Playstore! See full demo - [youtu.be/MK7OuClpYzw](https://youtu.be/MK7OuClpYzw) (link to app in video description). You can also try our web app at [translate.ghananlp.org](https://translate.ghananlp.org) #NLPProc #ghana #ml #nlp



**Ghana Natural Language Processing (NLP)** @GhanaNLP · 19h

To facilitate African trade, as requested by our app users, we are happy to unveil expansion beyond Ghanaian borders. Here we demo Yoruba speech recognition, currently in Beta testing. Which African languages should we add next? Audio by @SewadeOgun 🙏 #nlproc #africanlp #nigeria



# FFRTranslate

FFRTranslate

[Paper](#) [Github](#) [Short Video](#) [Other Projects](#)

French

Fon

Surprise Me!

Entrez votre texte ici

French

Fon

Suggest Translation

**#JoinUs**



It's on us (including you) to color this map for 202X!

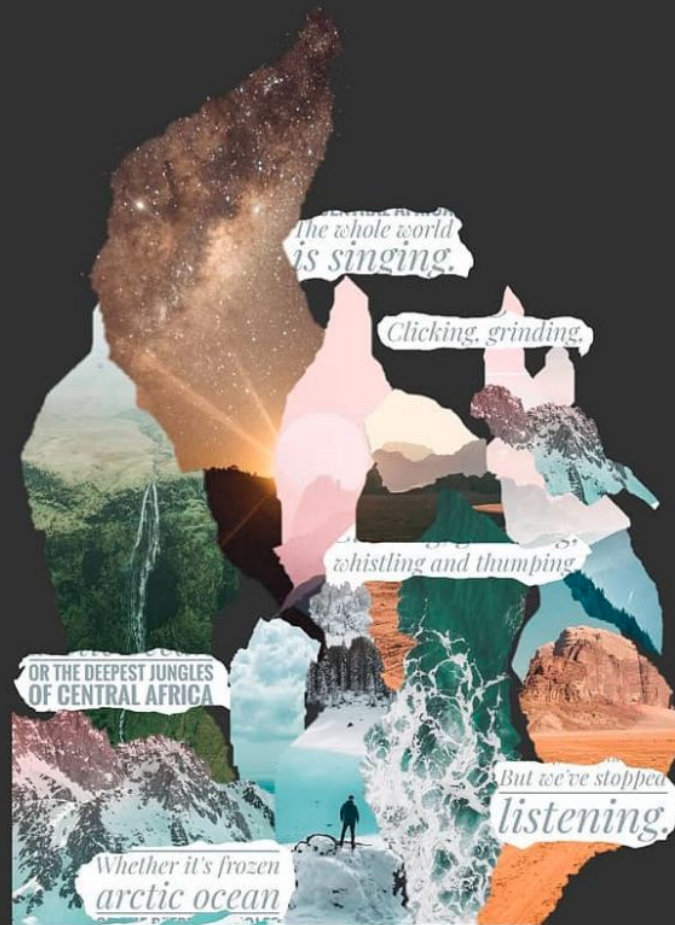
- **TRAIN A MODEL** - Contribute a trained model and related code for your language
- **ANALYSIS** - Contribute analysis of data/models for any African language(s).
- **DATA** - Help build or find datasets for your language
- **DOCUMENTATION** - Help document our discussions, progress.
- **MENTORSHIP** - Provide advice or help tune models for their languages and datasets, or help people get started
- **COLLABORATION** - On papers, workshops, data collection, ...

- **ADMIN-** Help out with administrative tasks and coordinate research outputs
- **COMPUTE** - Help with infrastructure and compute! Do you have spare compute to donate?
- **BRAINSTORM** - Join our weekly meetings, provide advice or ideas
- **STORY-TELLING** - Tell our stories to the world by doing talks about the community, contributing to our Medium publication, or engaging with media outlets
- **MLOps & ML Engineering-** If you are a software developer, ML engineer or support reproducibility, data gathering, and model sharing

## Road Ahead | #OurFuture

- Community growth
- Expand to more NLP tasks
- Qualitative analysis of models
- Evaluation of metrics
- Notebooks for transfer, self-supervised learning and data augmentation
- Expand size & domain of global test sets
- Reproducibility & comparability

Artwork by [Keneilwe Mokoena](#)







Artwork by [Keneilwe Mokoena](#)  
Her email: [keneilwe.bk@gmail.com](mailto:keneilwe.bk@gmail.com)  
Instagram: [@ke\\_neil\\_we](#)

# Masakhane

## “We build together”

**masakhane.io**

**Twitter: @MasakhaneNLP**

<https://github.com/masakhane-io/community-guidelines>

<https://bit.ly/masakhane-starting-together>

<https://bit.ly/masakhane-calendar>

<https://bit.ly/masakhane-mt-how-to-start>