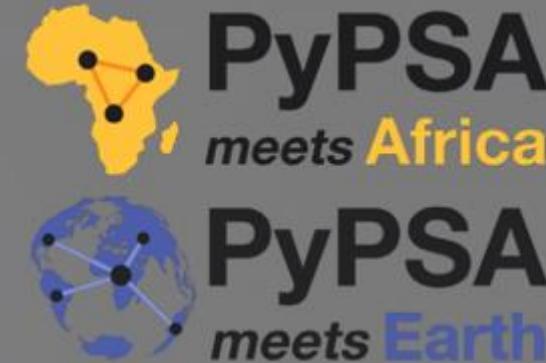


FROM AFRICA TO EARTH ENERGY SYSTEM MODELLING

THU, 27
JANUARY 2022
14:00 - 15:55
BST/UTC+0



Webinar on:



WEBINAR WITH PANEL DISCUSSION

Panellists associated to:





"Limiting global warming to 1.5°C would require rapid, far-reaching and unprecedented changes in all aspects of society" - IPCC



WE NEED TO PLAN NOT
ONLY OPERATIONS BUT
ALSO INVESTMENTS

AFFORDABLE

RELIABLE

SUSTAINABLE

Global Independent Research Initiative



SOLVER

Help sustaining
Support developers
Reveal bottlenecks
Initiate new paths

ENERGY SYSTEM MODELS

High resolution
Features
Problem formulator
Modular

DATA

Creating open data
Predicting data
Data workflow
High resolution

USER AND DEVELOPER COMMUNITY

Open
Collaborative
Training
Empower

Dialogue

VISION



Create **TOGETHER** useful alternatives
to closed-source energy system models
for industry and research

I.

THE PYPSA MEETS
EARTH INITIATIVE

II.

THE PYPSA-AFRICA
PROTOTYPE
PRESENTATION

III.

DEALING WITH
MISSING DATA

IV.

] HOW TO GET
INVOLVED IN OUR
EARTH-MISSION

Q&A
15min

V.

PANEL DISCUSSION
"THE ENERGY SYSTEM
MODELLING CHALLENGES
AND OPPORTUNITIES OF
THE 21 CENTURY"

Q&A
15min

I.

**THE PYPSA MEETS
EARTH INITIATIVE**

II.

**THE PYPSA-AFRICA
PROTOTYPE
PRESENTATION**

THE PROBLEM

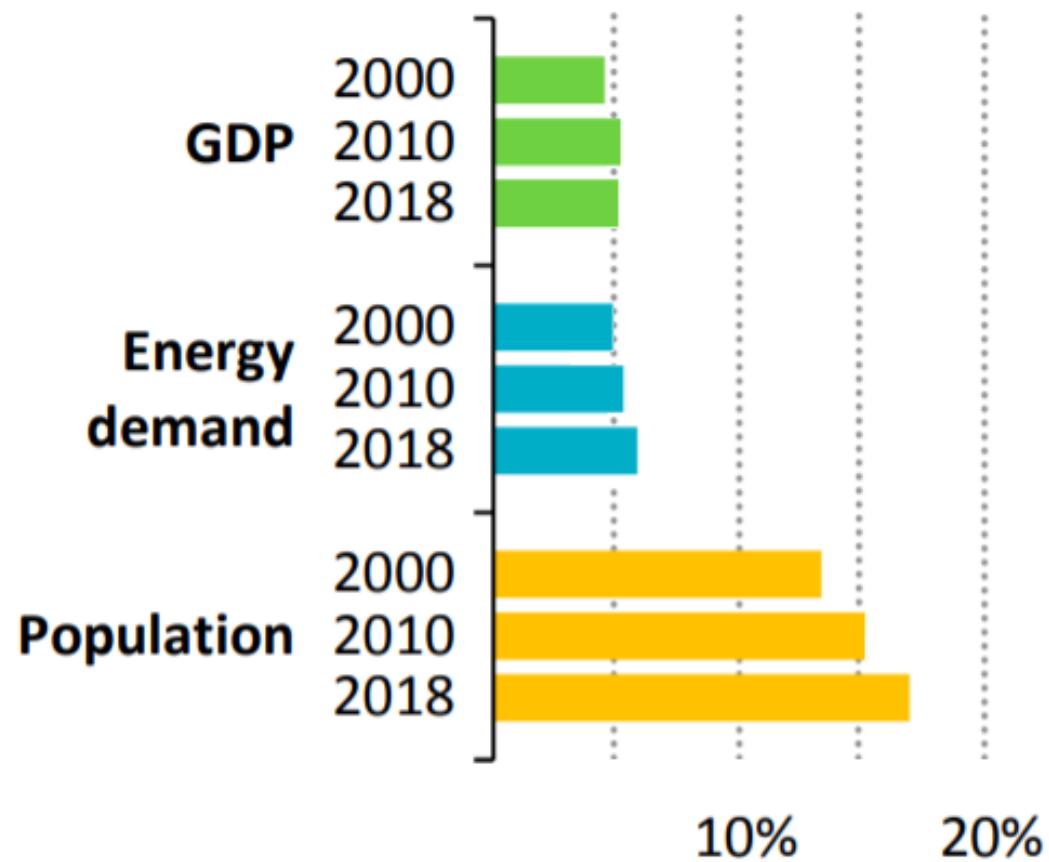


AFRICA IS DARK!

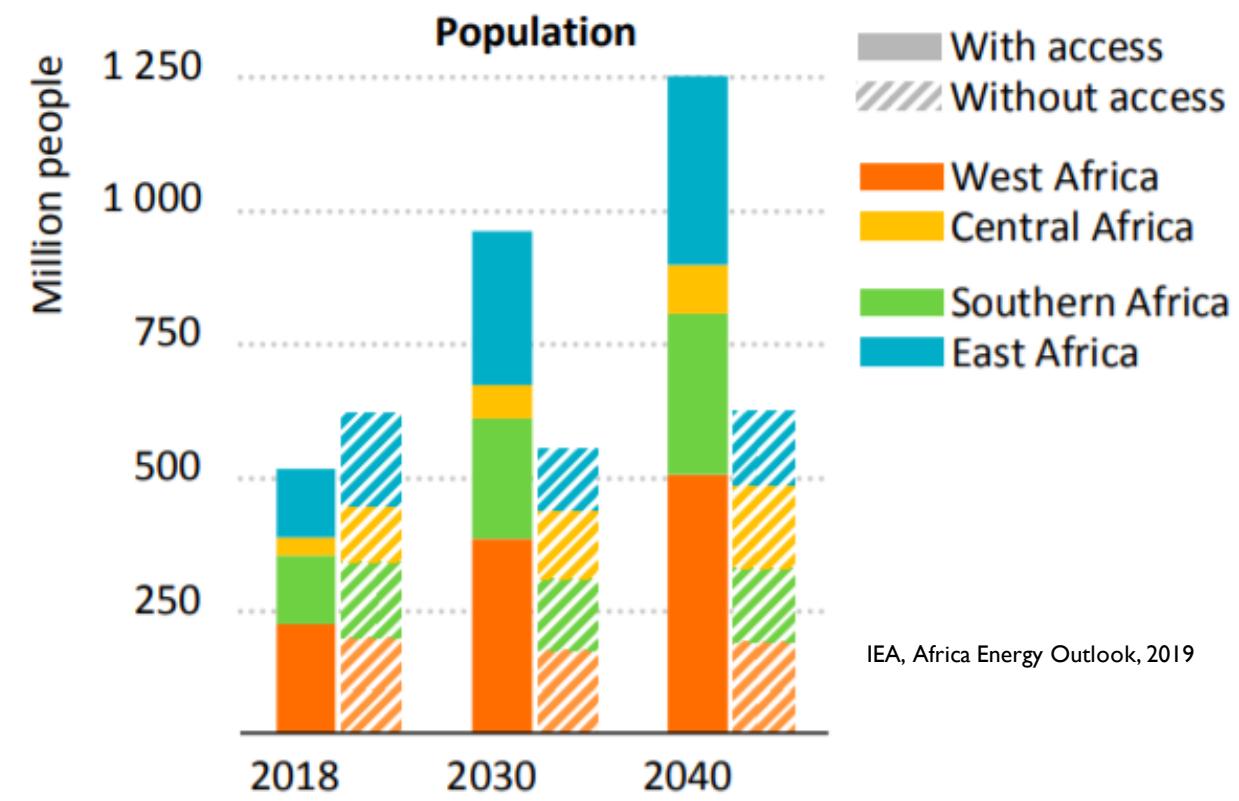


PROBLEM WILL GROW

Per capita indicators shall increase ...



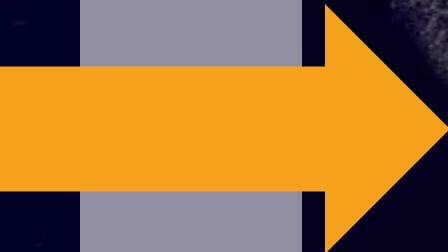
... and population is growing ...



PLANNING FOR A BRIGHT FUTURE

TOOLS FOR:

- Policy analysis
- Investment analysis
- Continent-wide synergies
- Decarbonization pathways

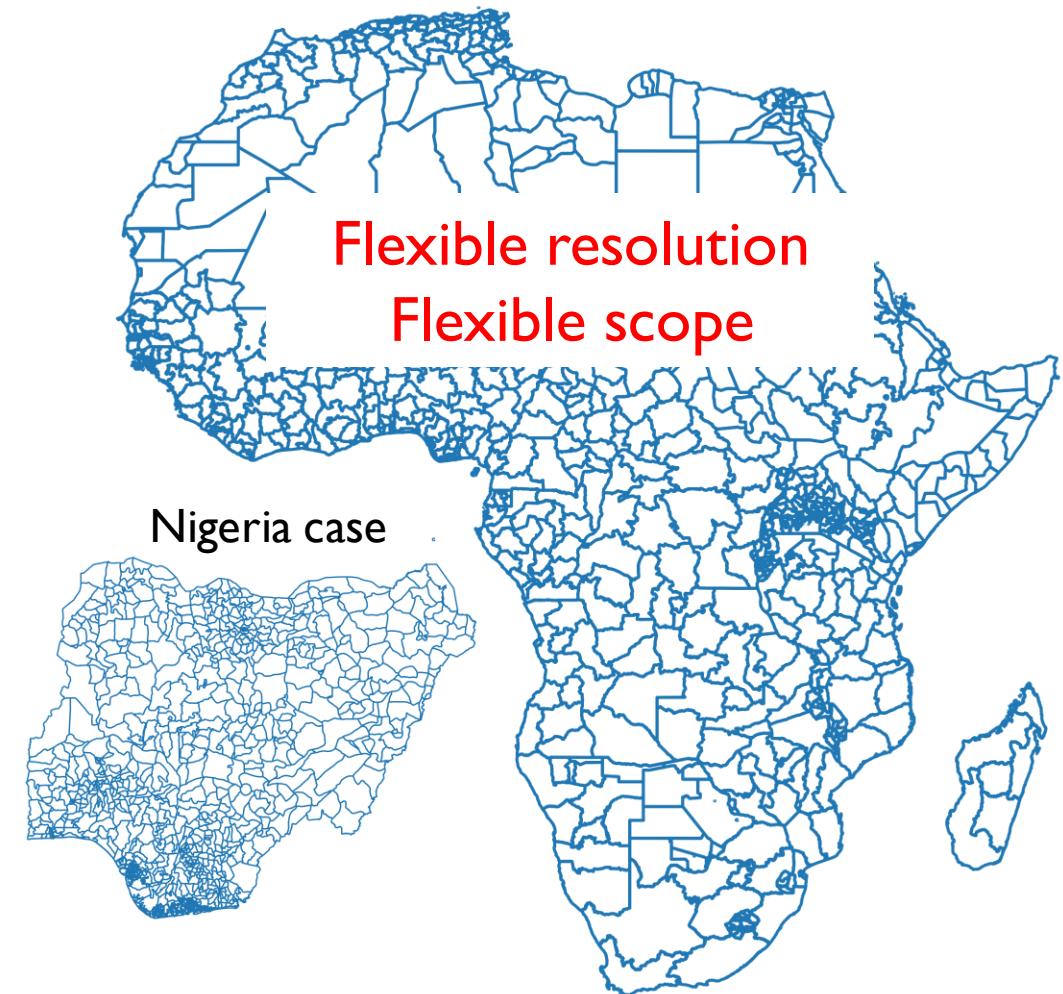


ROLE OF PYPSA

Standard models



PyPSA-Africa



PYPSA-AFRICA FEATURES

Policy makers and utilities need:

- **Robust**
- **Low cost**
- **Reliable**
- **Easy-to-use**
- **Planning & dispatch tools**

PYPSA-AFRICA FEATURES

Policy makers and utilities need:

- **Robust** Built on top of PyPSA-Eur, ...
- **Low cost** Open-source model
- **Reliable** Community support (>60pp)
- **Easy-to-use**  python™
- **Planning & dispatch tools**

Scenario analysis

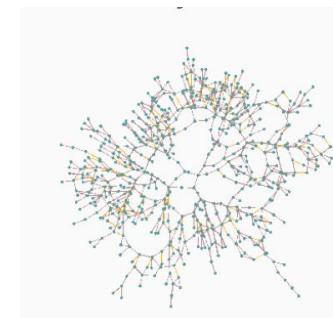
Adjustable resolution

Sector-coupling (coming soon)

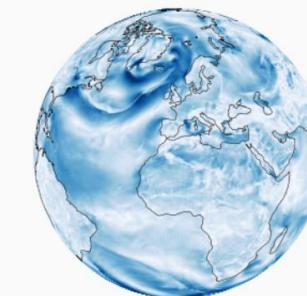


PyPSA
meets Africa

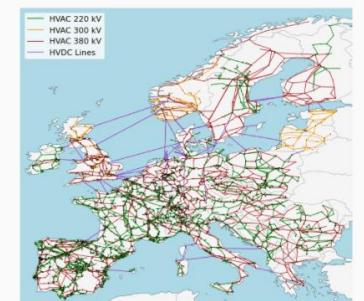
Credits also to



PyPSA

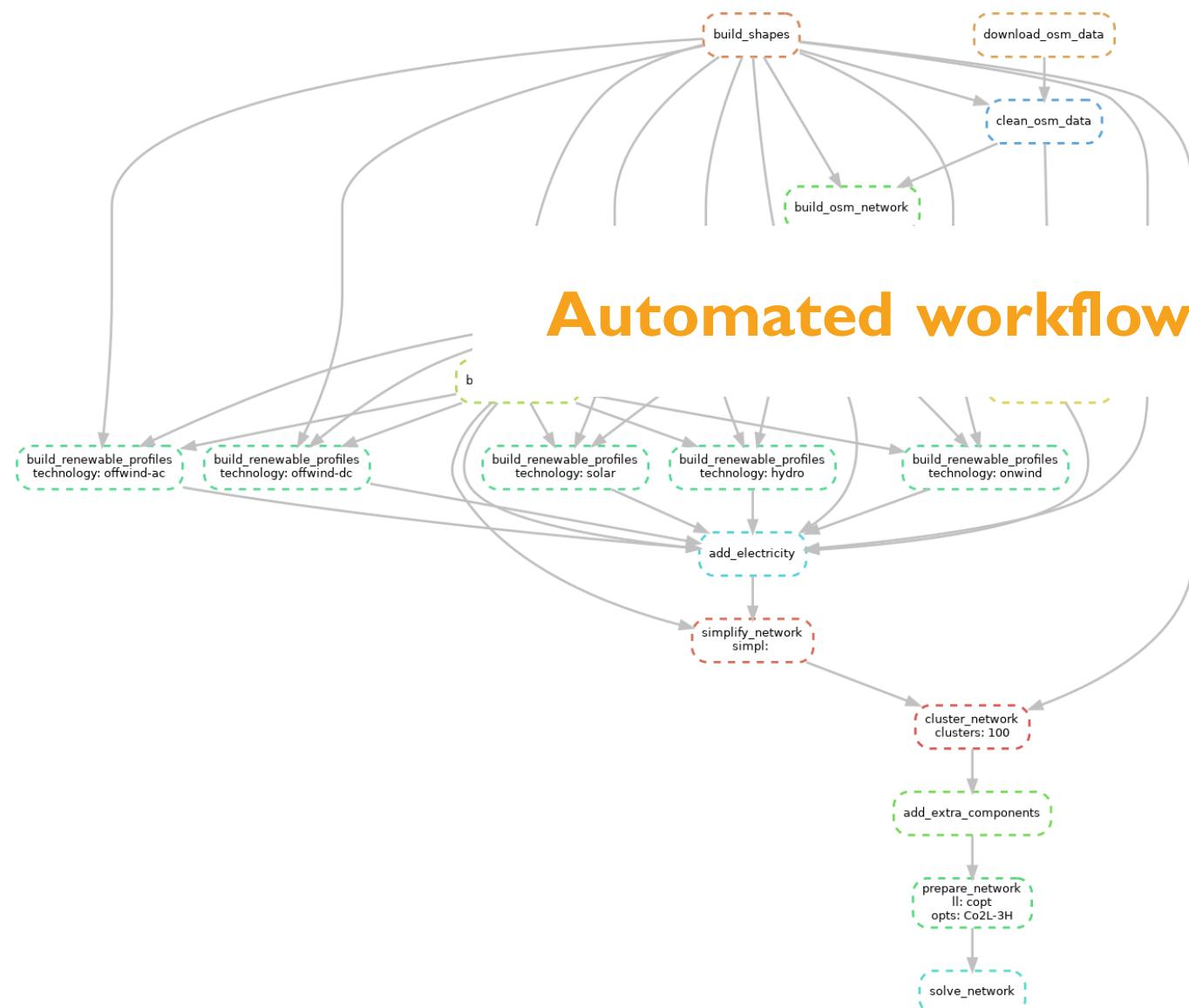


Atlite



PyPSA-Eur

HOW IT WORKS



Config file

Data processing

Download data

Filter data

Combine data

Create model

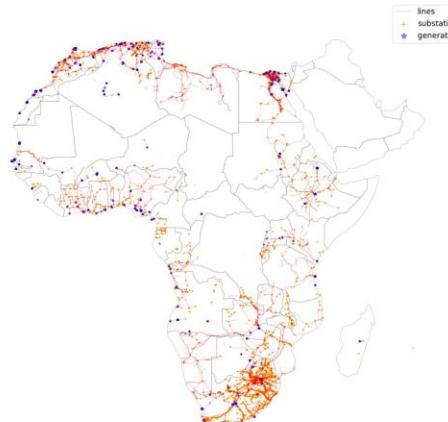
Solve

Results

DATA PROCESSING

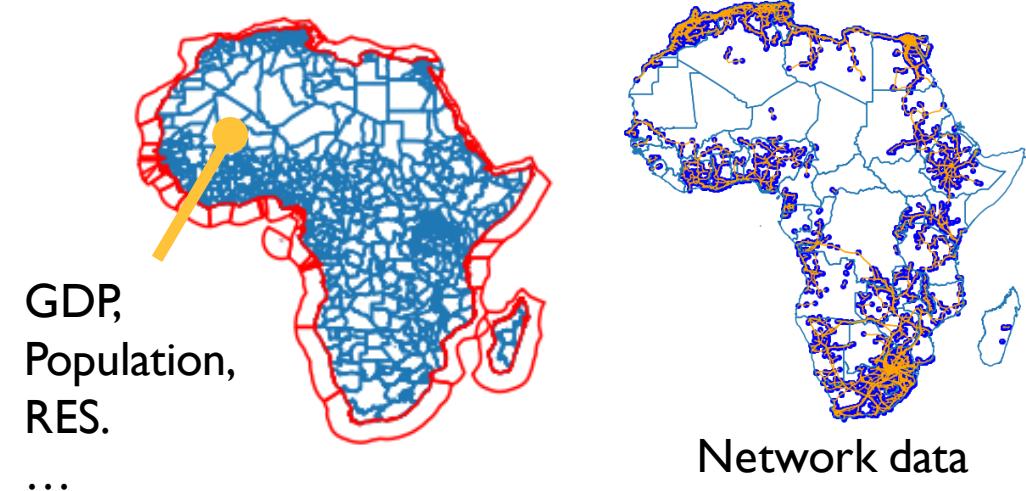
Open-source datasets:

- OpenStreetMap (OSM)
- Database of Global Administrative Areas (GADM)
- ERA5 from Copernicus Climate Change Service
-



Download data
Filter data
Combine data

- **Accurate network description**
- **Demand and renewable by region**



A photograph of an underwater environment. Sunlight filters down from the surface in bright rays, illuminating a sandy ocean floor. In the background, there are large, rounded rock formations or hills covered in greenish algae. The water is a deep blue-green color.

DEEP DIVE

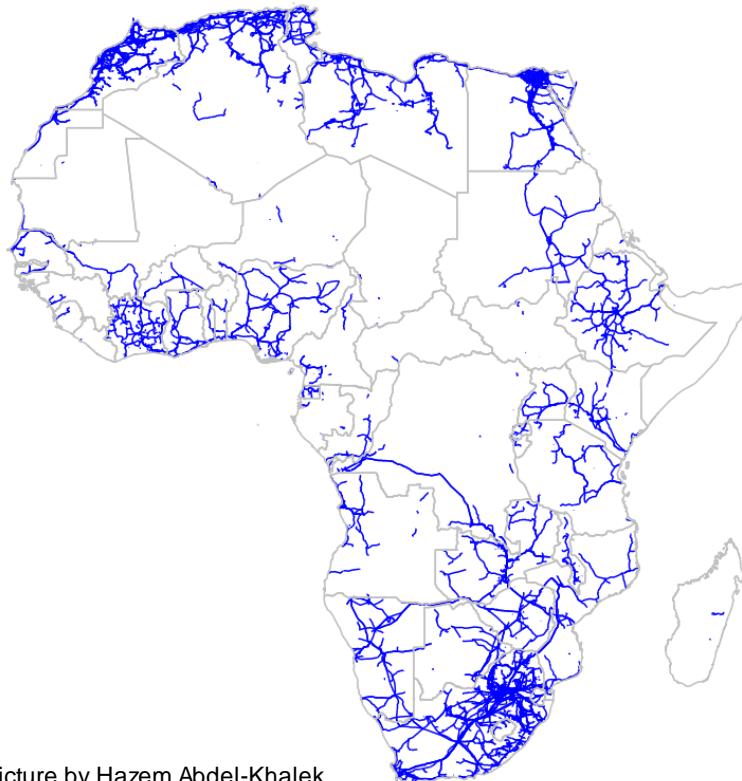
THE PYPSA-AFRICA PROTOTYPE

1. Network data by Open Street Map
2. Powerplant data
3. Renewables and demand assessment
4. Clustering to deal with complexity
5. Network augmentation
6. Some results

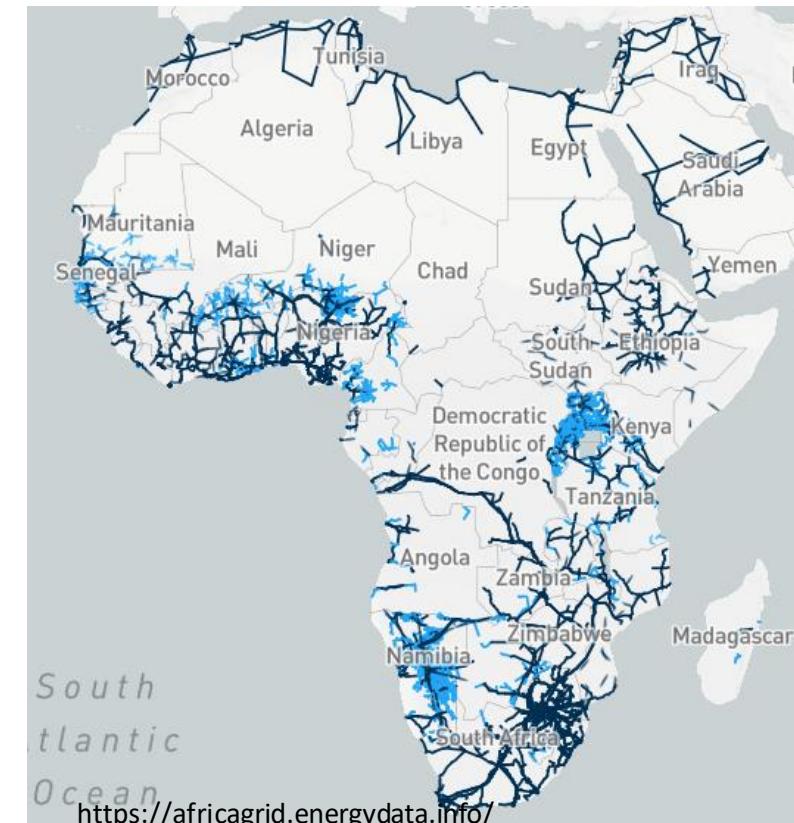
NETWORK DATA OPENSTREETMAP

For the African continent ...

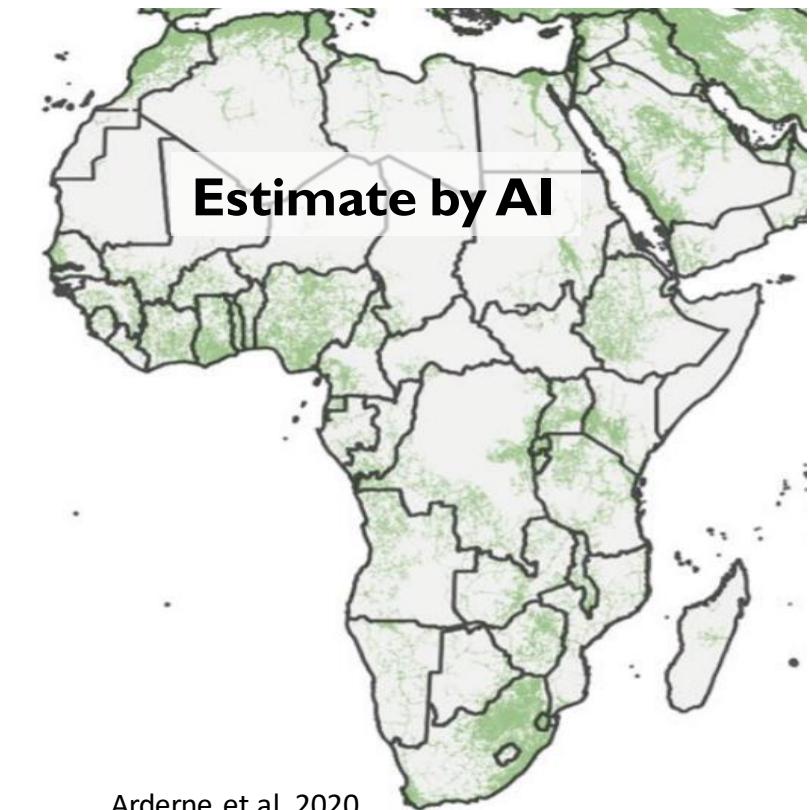
countries: ["africa"]



Picture by Hazem Abdel-Khalek



Good but improvements needed

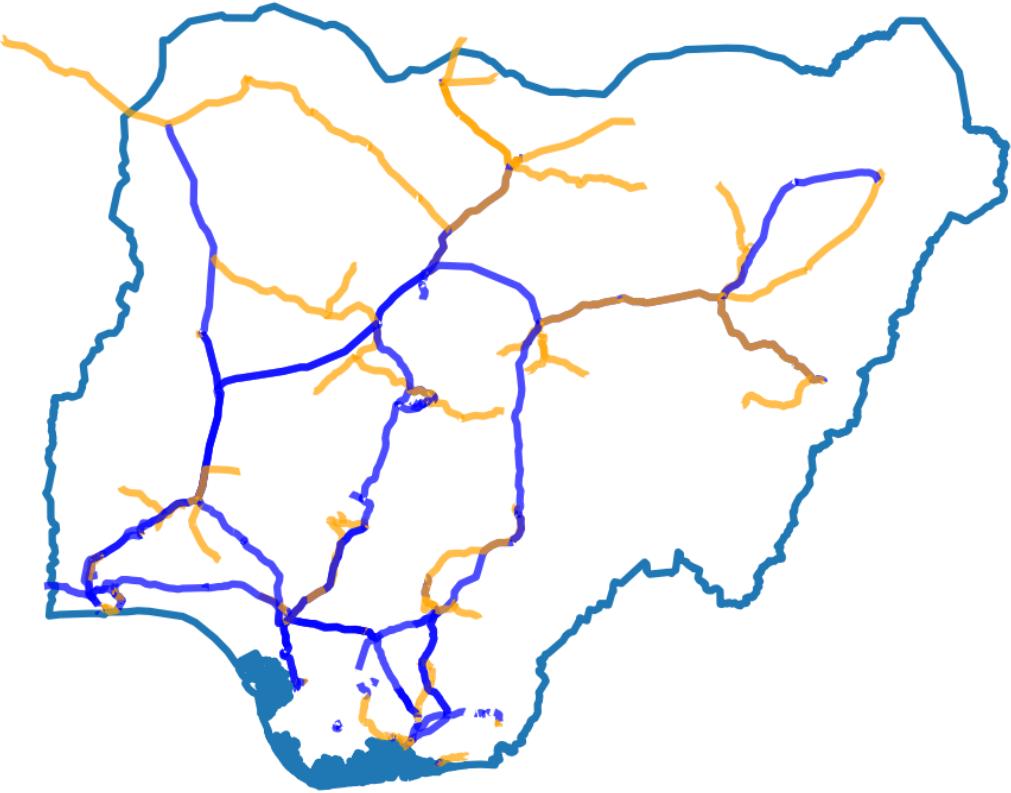


Arderne et al. 2020

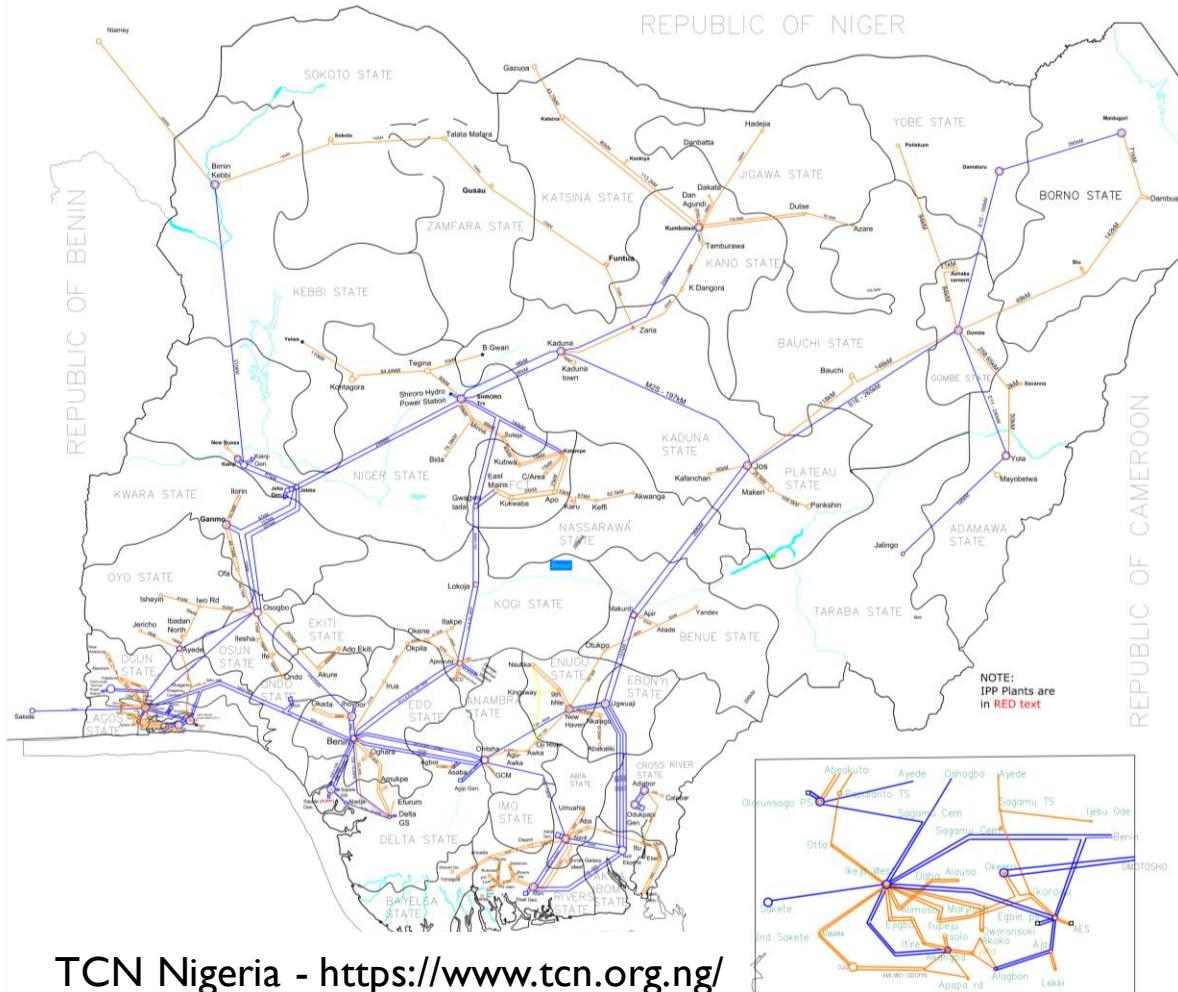
NETWORK DATA OPENSTREETMAP

... and (group of) countries

countries: ["NG"]



100% validation of topology, data TSO



POWERPLANTS

WHAT DATASET?

- Carbon Monitoring for Action (**CARMA**)
- Global Energy Observatory (**GEO**)
- Global Power Plant Database (**GPD**)
- OpenStreetMap (**OSM**)
- ...

POWERPLANTS

WHAT DATASET?

- Carbon Monitoring for Action (**CARMA**)
- Global Energy Observatory (**GEO**)
- Global Power Plant Database (**GPD**)
- OpenStreetMap (**OSM**)
- ...

ALL! Powerplantmatching!

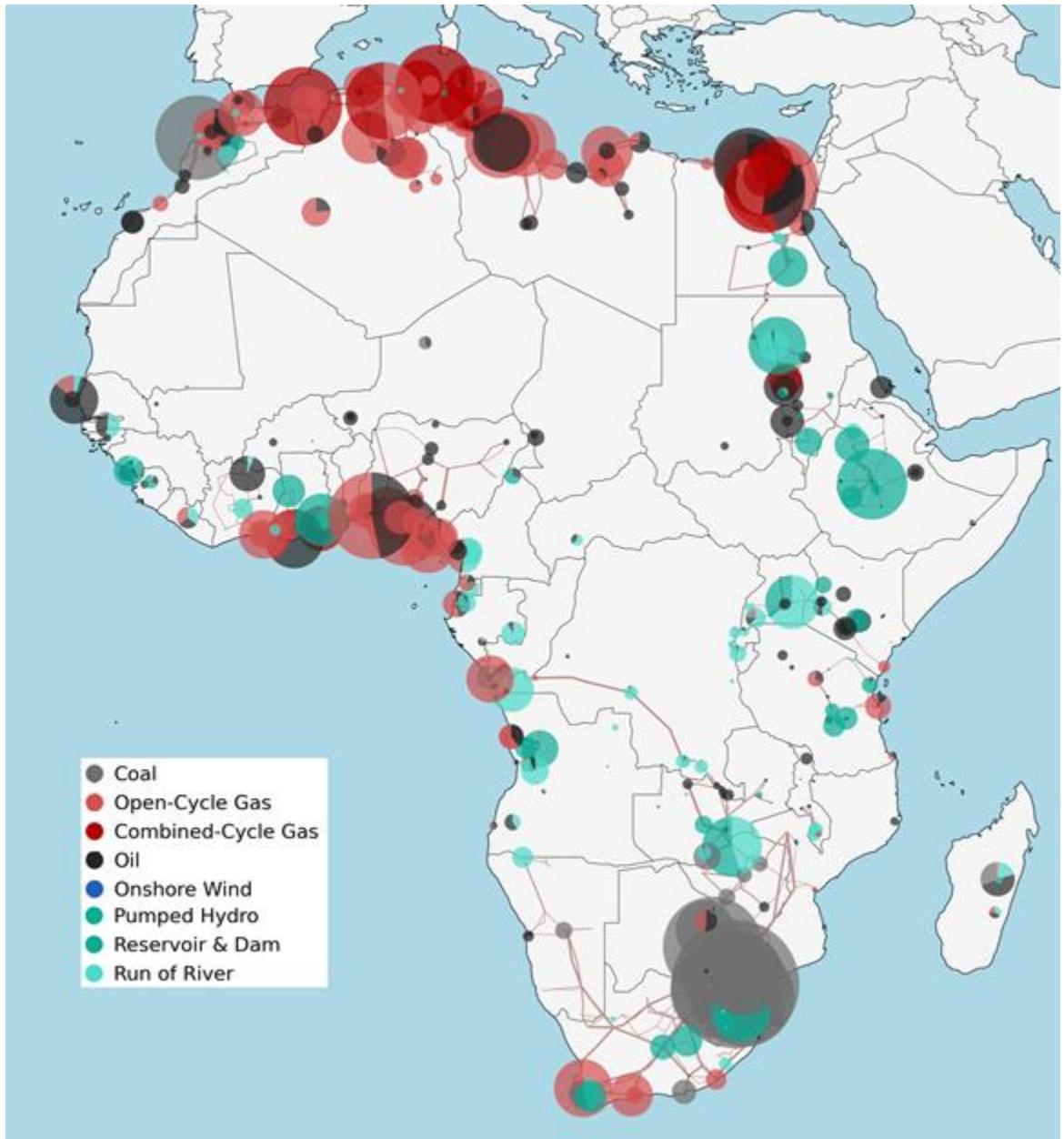
POWERPLANTS

Datasets to merge:

- Carbon Monitoring for Action (**CARMA**)
- Global Energy Observatory (**GEO**)
- Global Power Plant Database (**GPD**)
- OpenStreetMap (**OSM**)
- ...yours?



Merge datasets by
Powerplantmatching



POWERPLANTS

Datasets to merge:

- Carbon Monitoring for Action (**CARMA**)
- Global Energy Observatory (**GEO**)
- Global Power Plant Database (**GPD**)
- OpenStreetMap (**OSM**)
- ...yours?

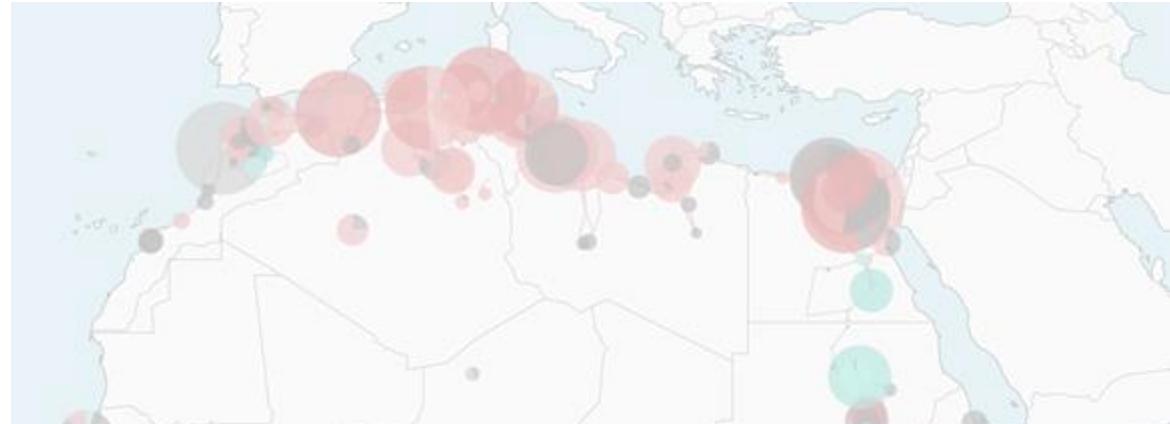


Merge datasets by
Powerplantmatching

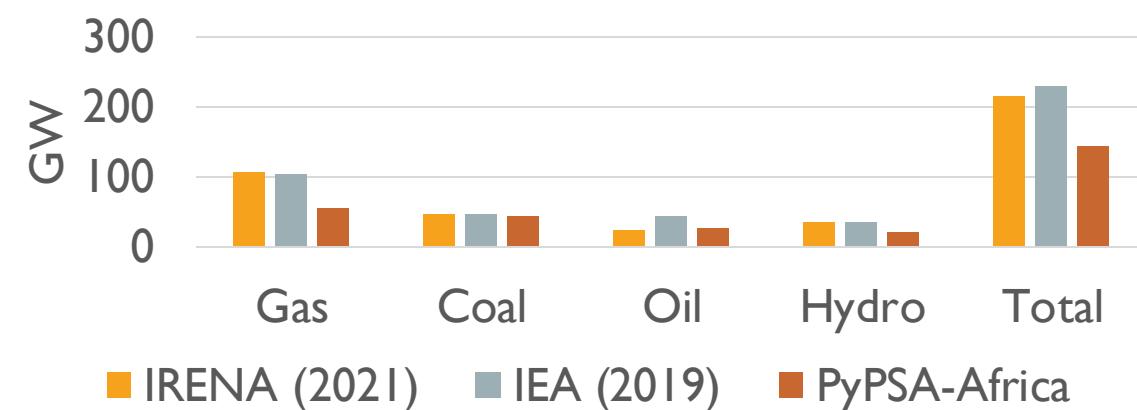


Help welcome on

- Country-level validation
- Merge different datasources (powerplantmatching)
- Look for accurate data



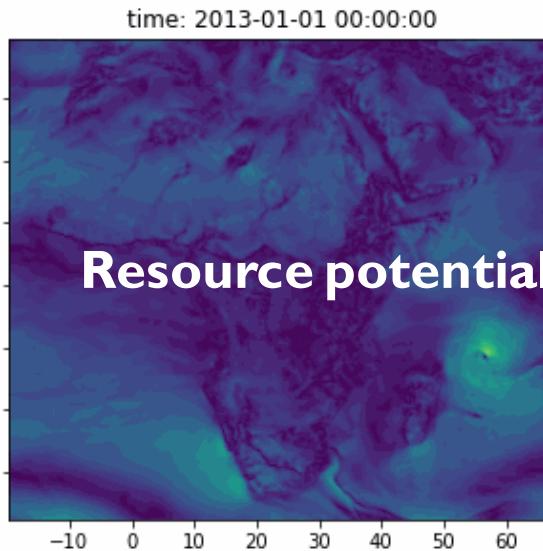
Data validation - Africa



■ IRENA (2021) ■ IEA (2019) ■ PyPSA-Africa



RENEWABLE PRODUCTION



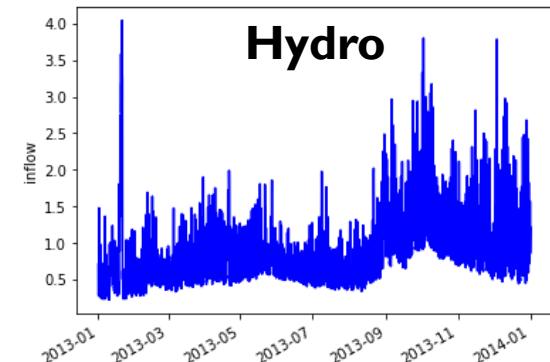
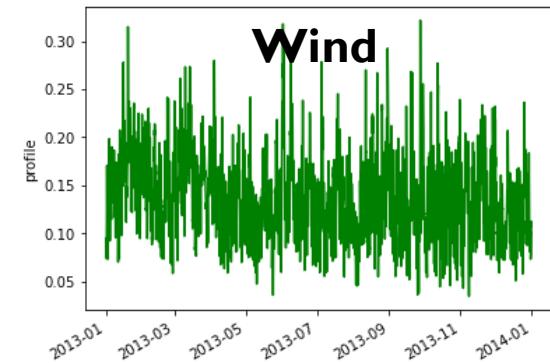
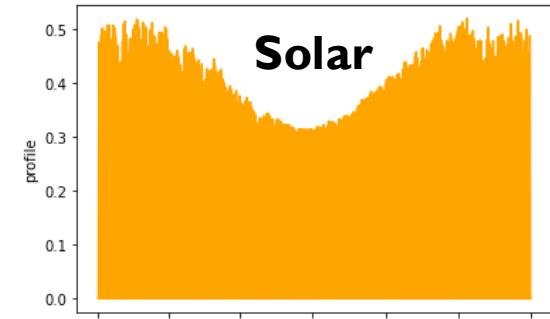
Land constraints



Pictures by Johannes Hampp



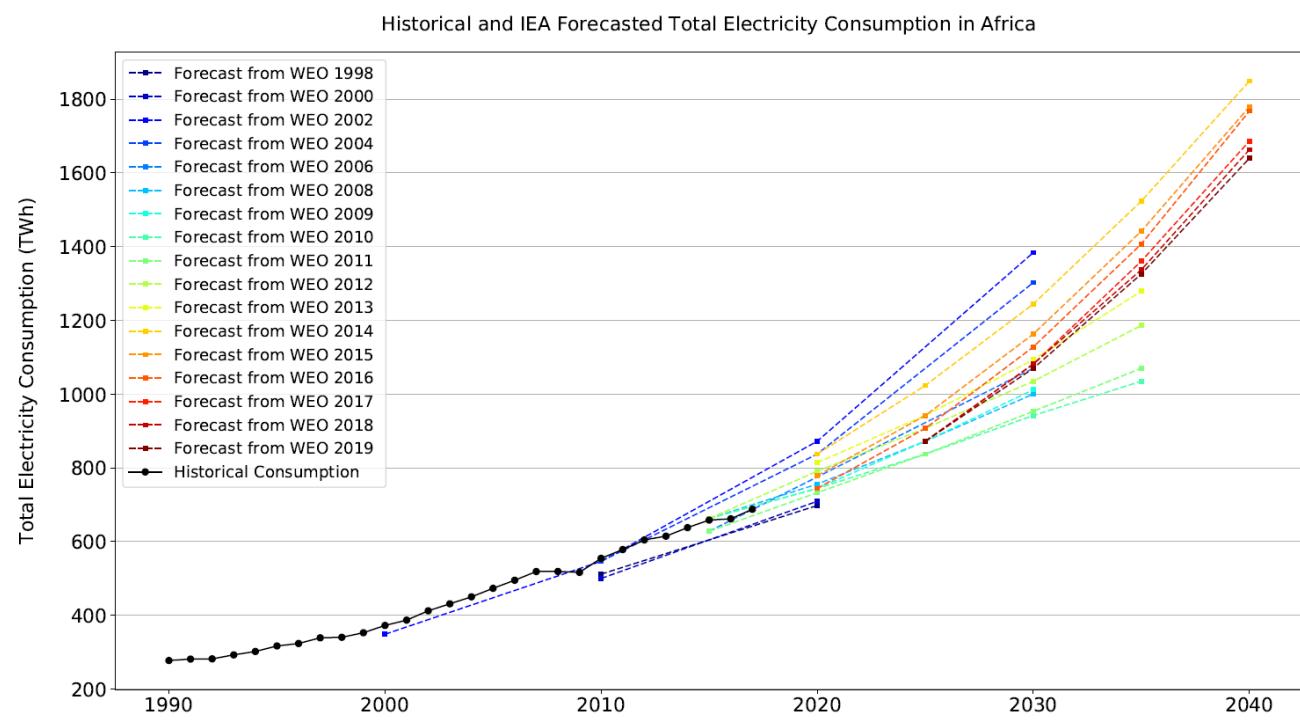
Atlite



CSP (coming),...

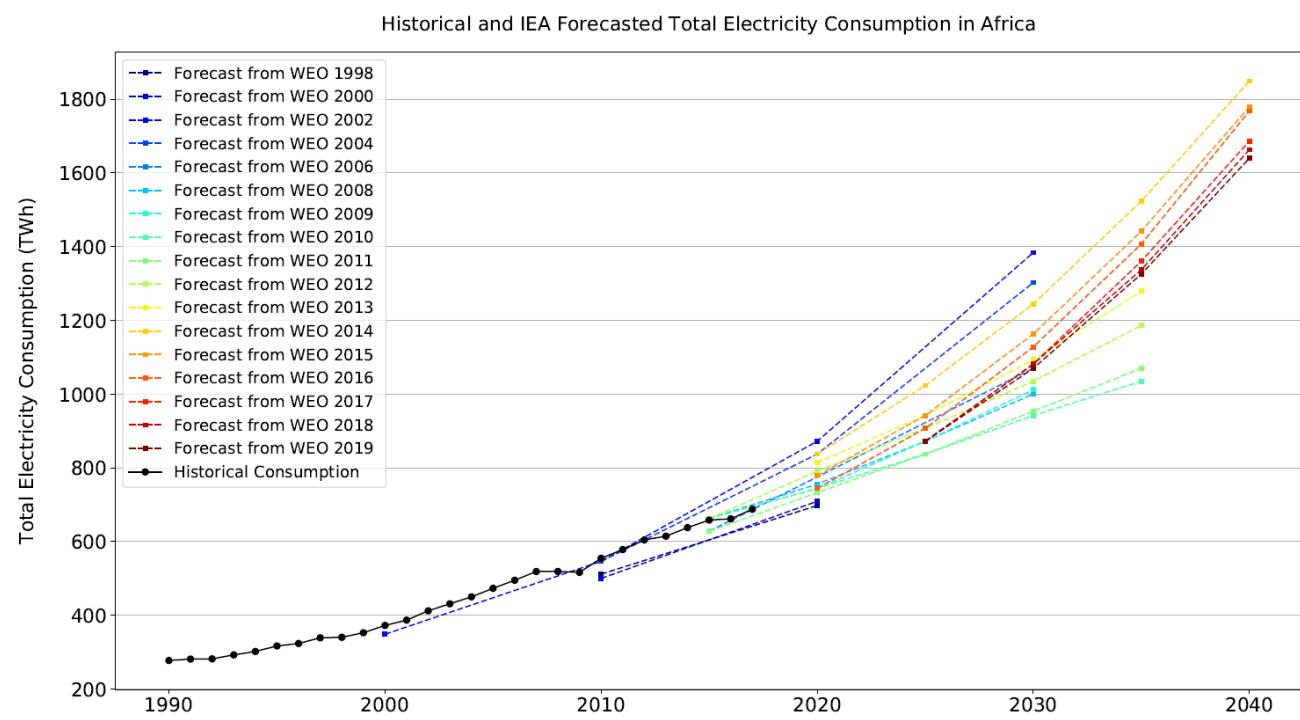
DEMAND DATA

Forecasting is not easy!



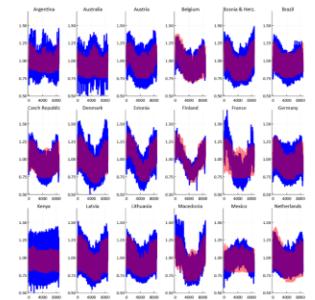
DEMAND DATA

Forecasting is not easy!

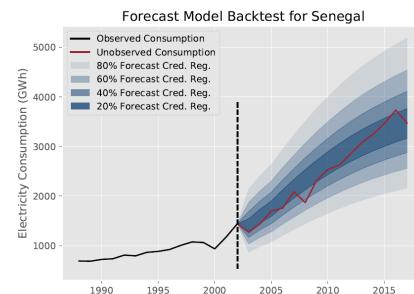


Use different models!

I) GlobalEnergyGIS*
(currently used)

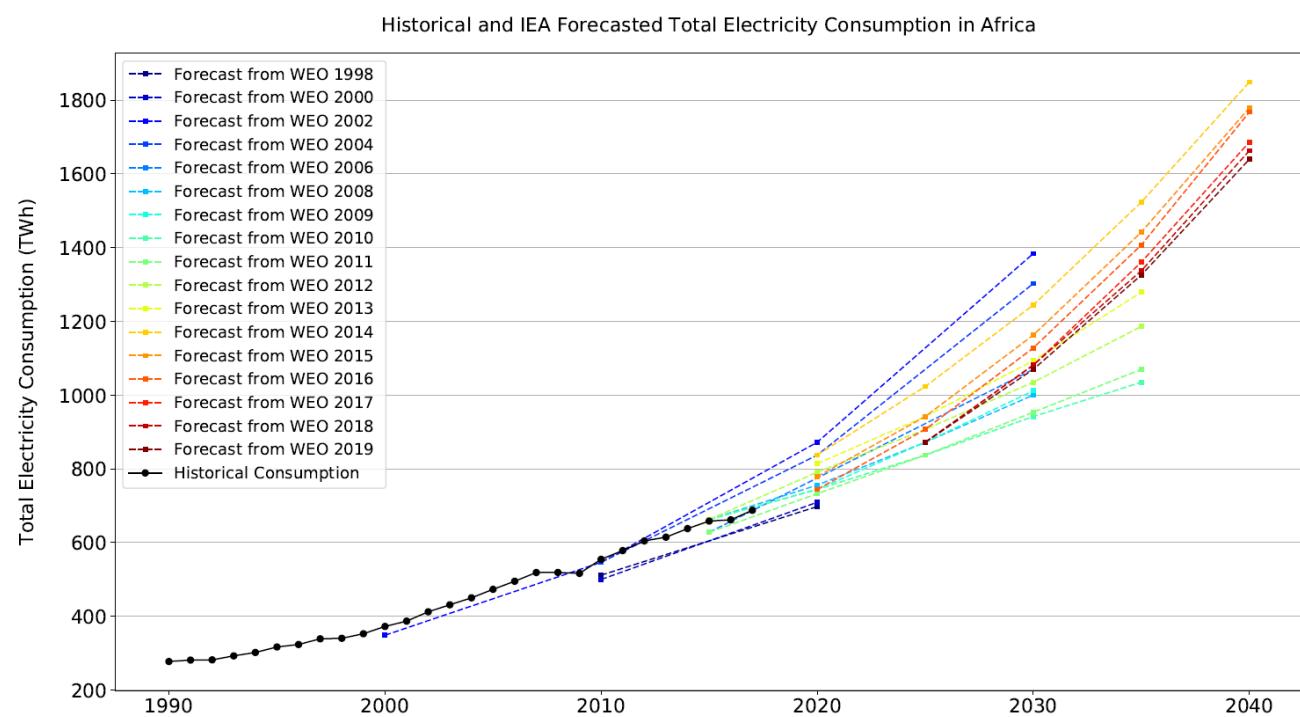


2) Demand-Creator
(coming)



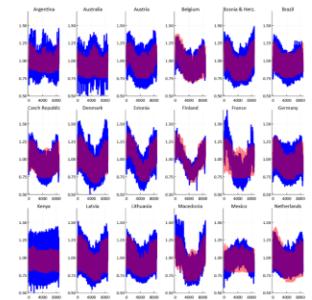
DEMAND DATA

Forecasting is not easy!

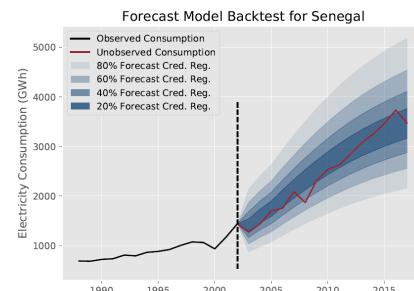


Use different models!

I) GlobalEnergyGIS*
(currently used)



2) Demand-Creator
(coming)

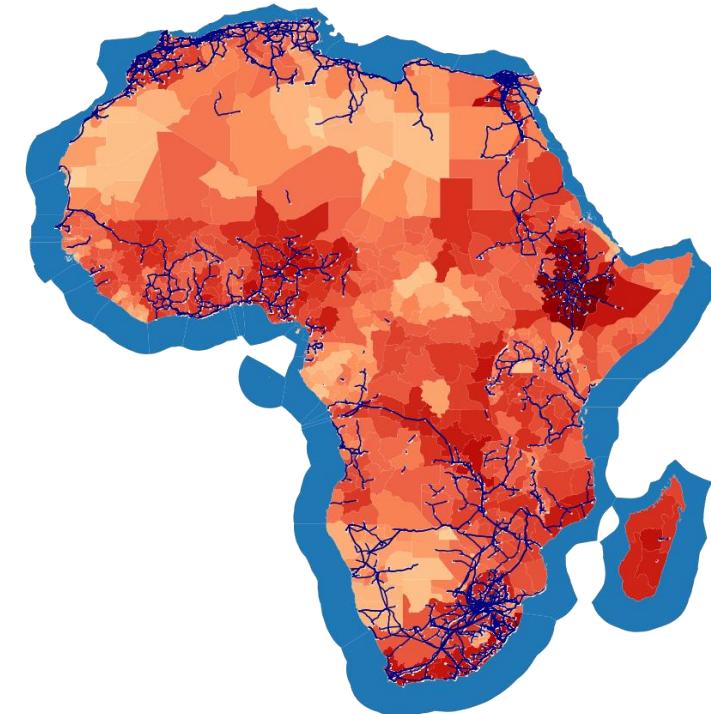


3) Your model!

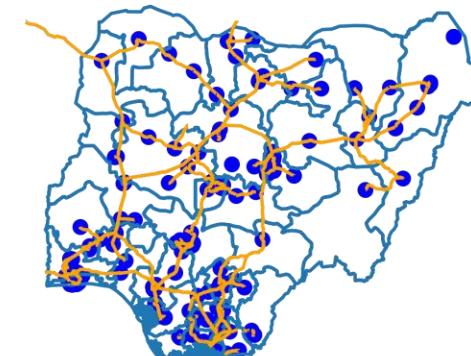
CLUSTERING FOR TRACTABILITY

Cleaned Network

["Africa"]



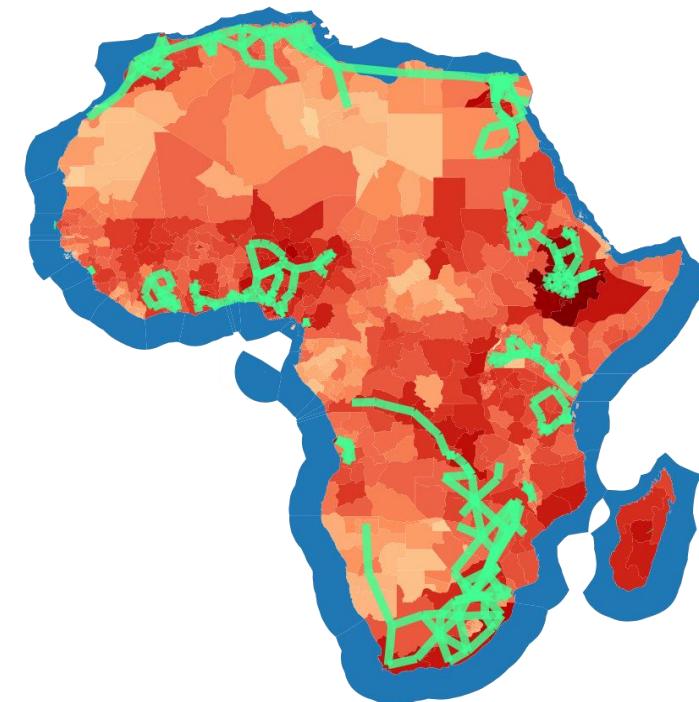
["Nigeria"]



After clustering

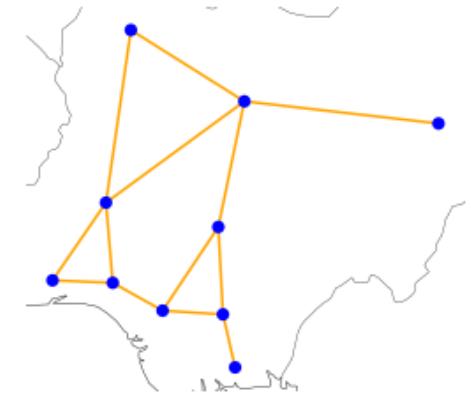
["Africa"]

420-node grid, distr. param.: "load"



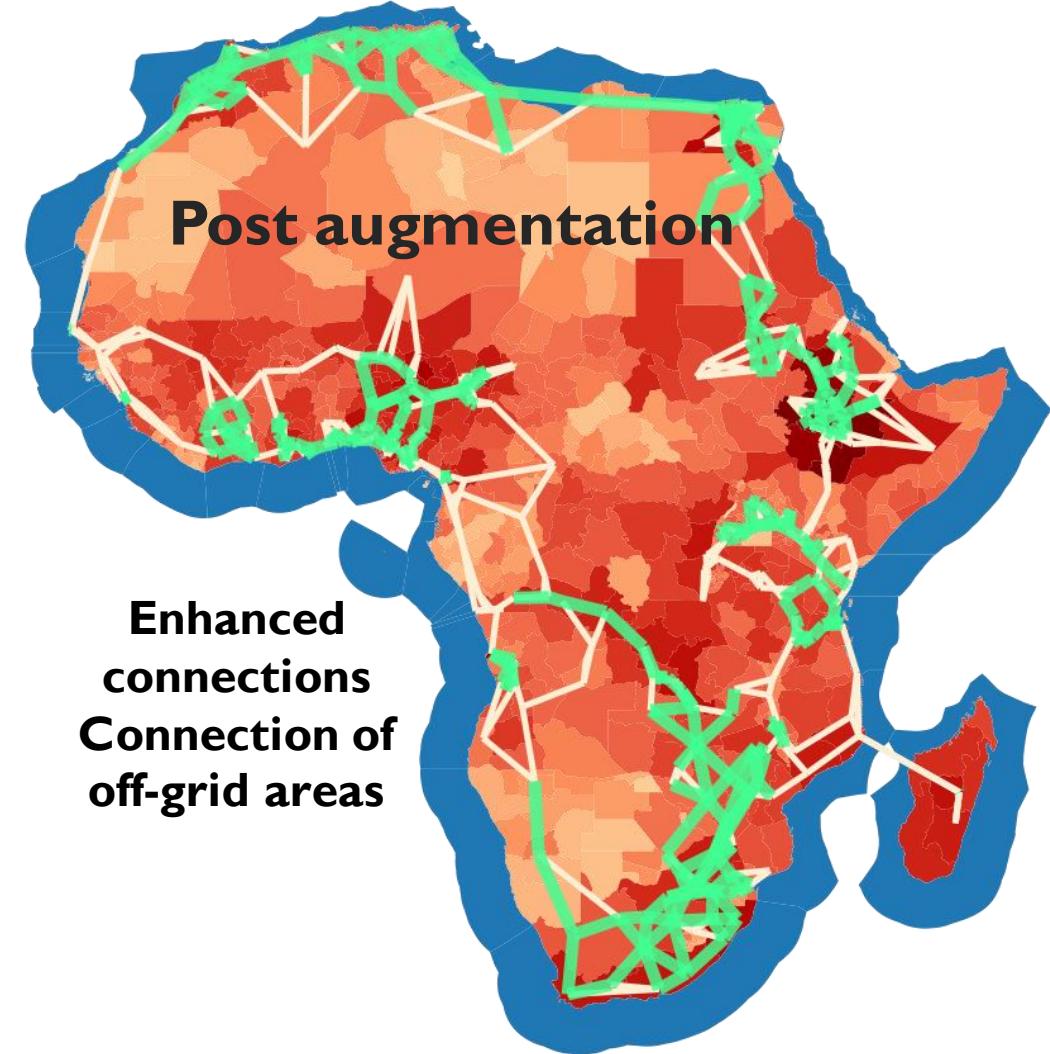
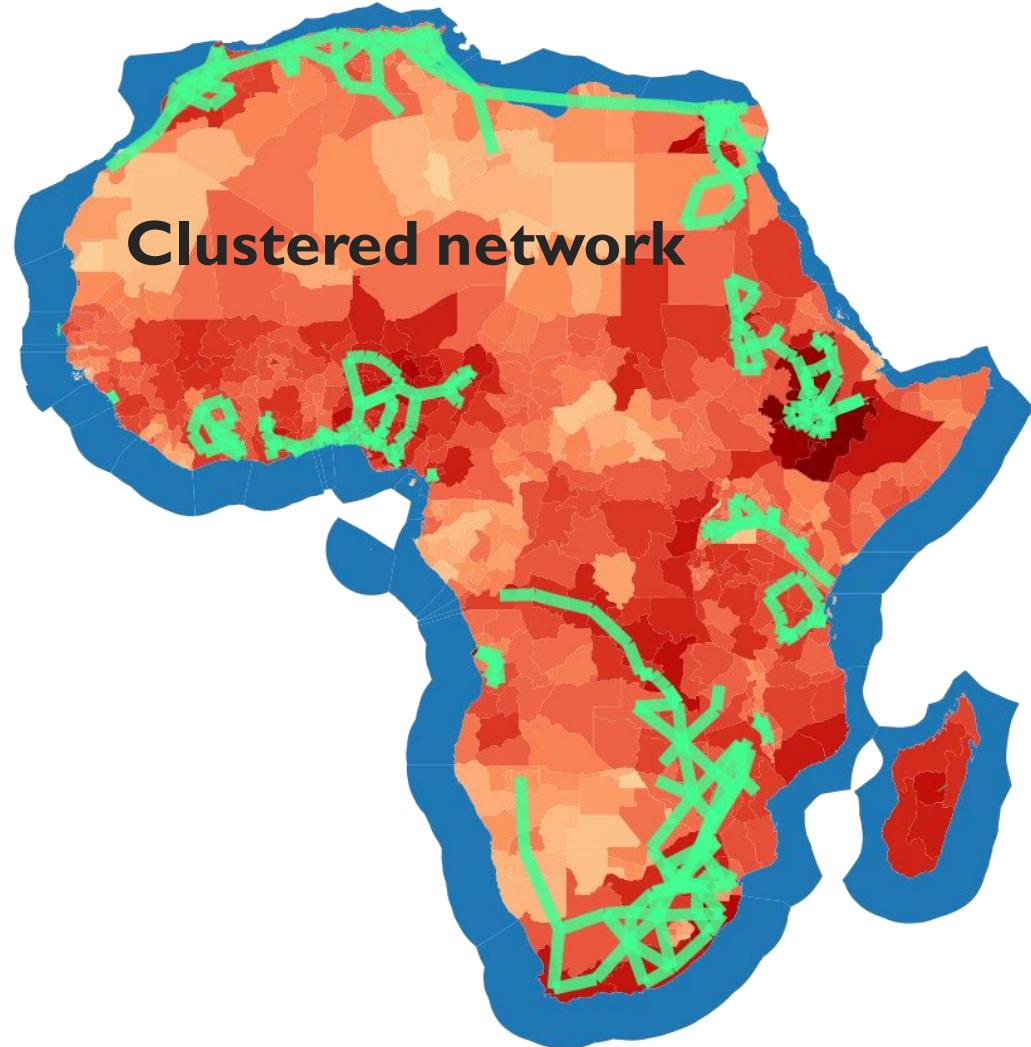
["Nigeria"]

10-node grid

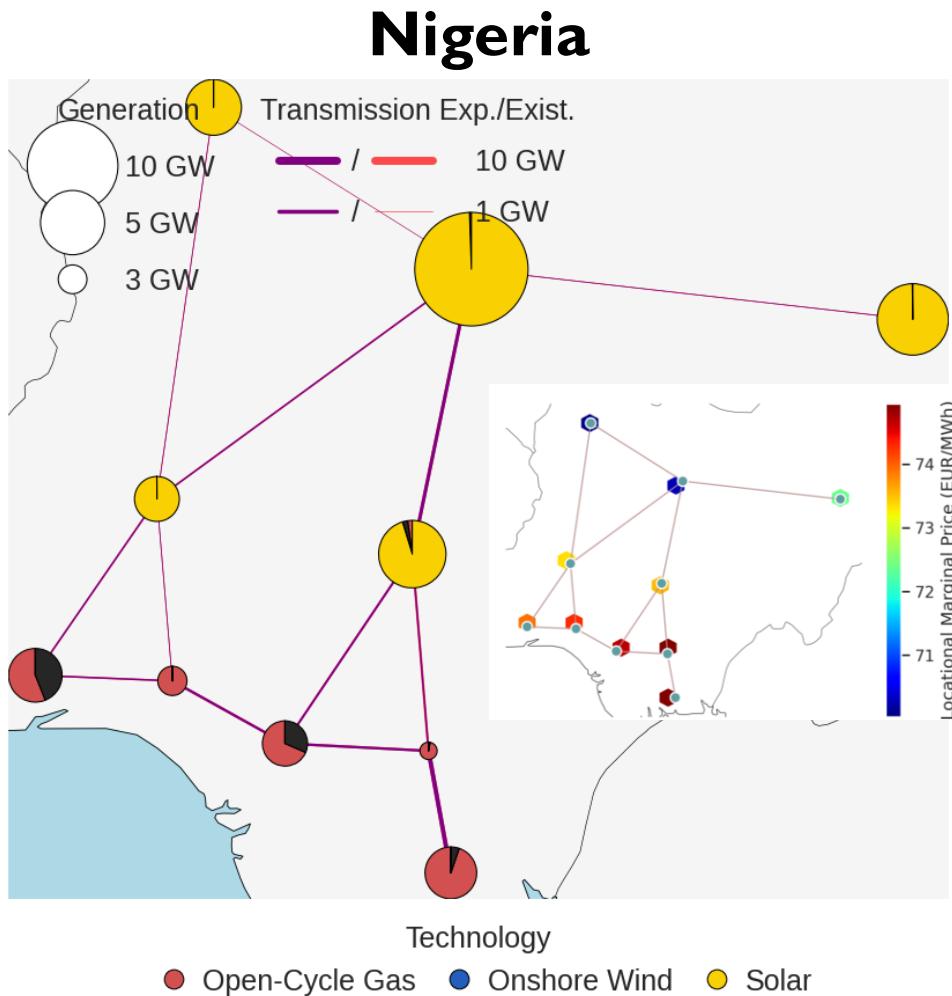


Reduction of complexity
Preserve representation of the system

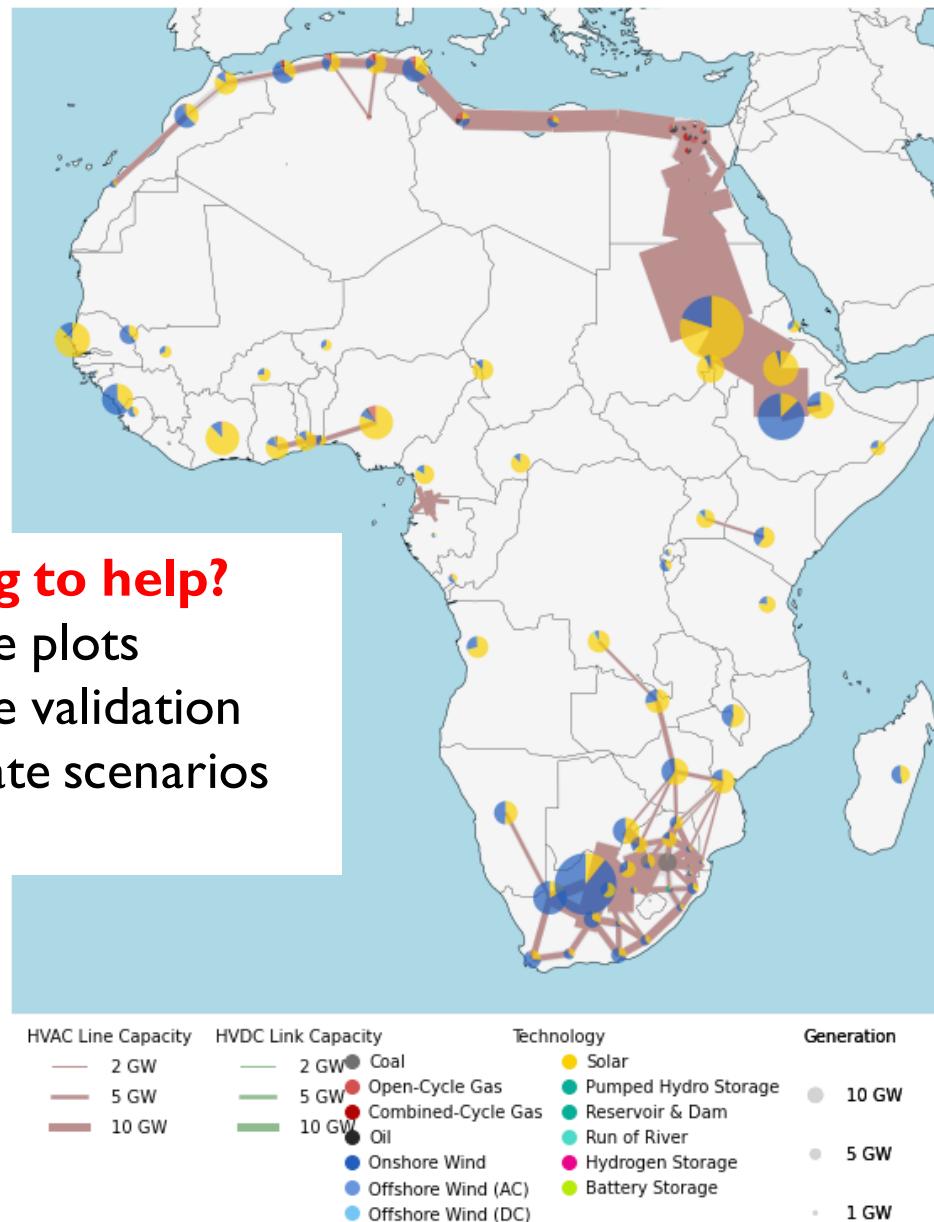
NETWORK AUGMENTATION



DESIGN & DISPATCH OPTIMIZATION



Africa



WHAT NEXT

Low data accuracy?

Only electricity?

Single-year?

WHAT NEXT

Low data accuracy?

Ongoing validation!
«Linkers» to use most reliable source

Only electricity?

Single-year?

WHAT NEXT

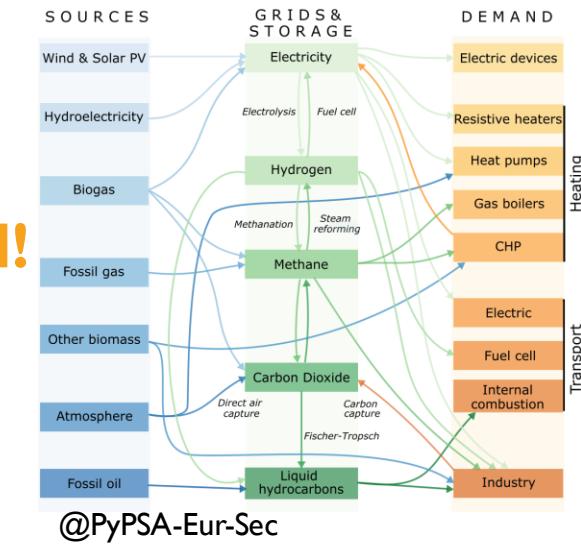
Low data accuracy?

Only electricity?

Single-year?

Ongoing validation!
«Linkers» to use most reliable source

PyPSA Africa Sector coupled!



@PyPSA-Eur-Sec

WHAT NEXT

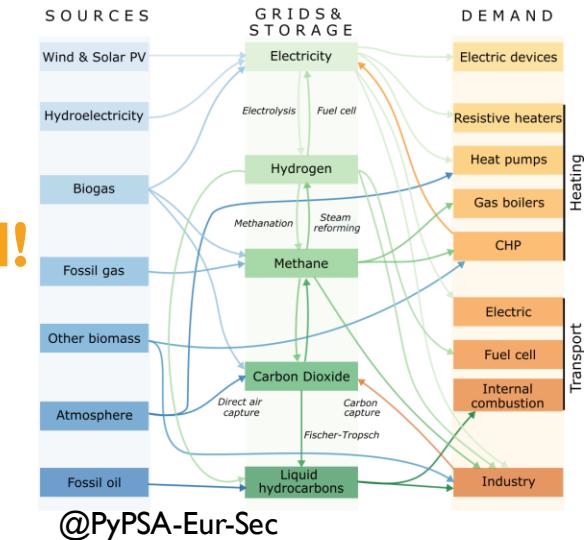
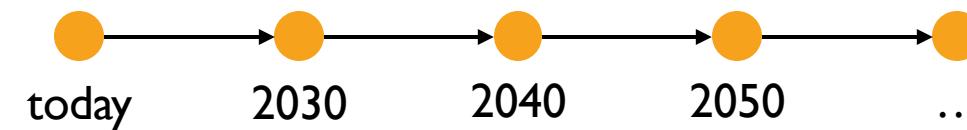
Low data accuracy?

Only electricity?

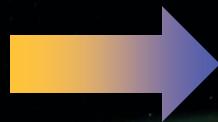
Single-year?

Ongoing validation!
«Linkers» to use most reliable source

PyPSA Africa Sector coupled!



Pathway optimization!

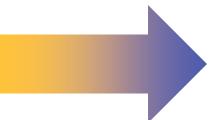


PYPSA MEETS EARTH

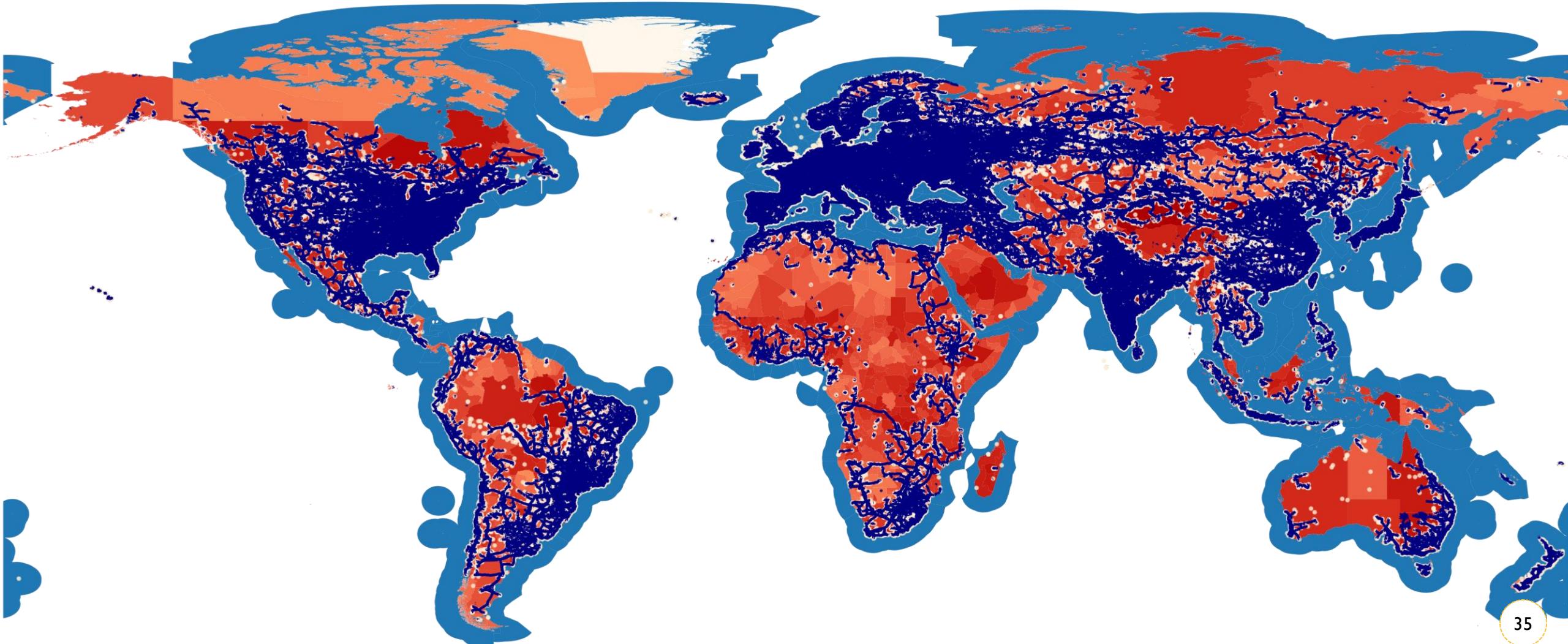
2022 GETTING READY TO CHANGE THE WORLD

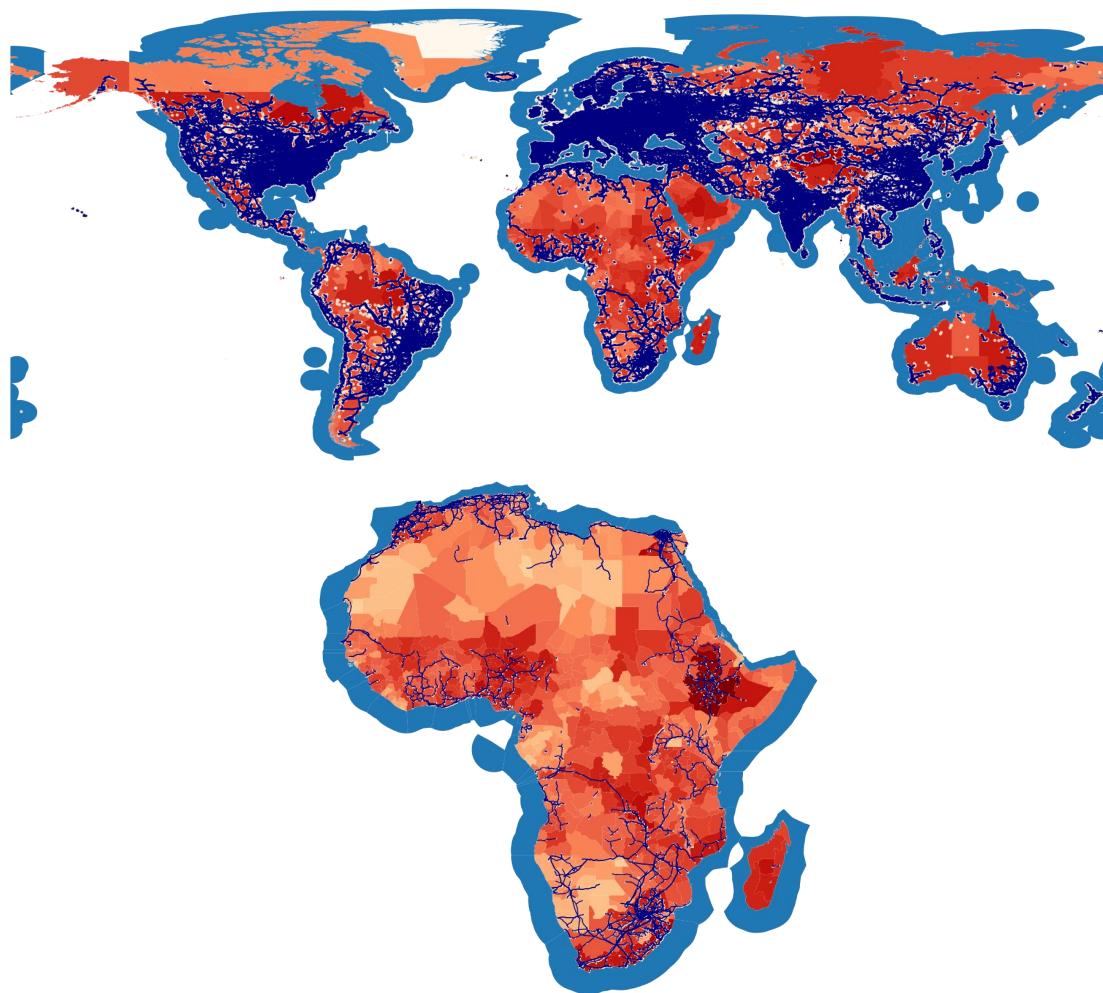
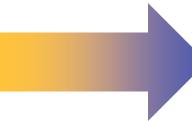


PyPSA
meets **Africa**



PyPSA
meets **Earth**





PyPSA-Africa and PyPSA-Earth welcome support for:

- Electrical and energy engineers, computer science, data scientists, GIS experts and Python developers.
- High-level insights from NGOs, governmental entities and project developers.
- Contributors to validate country data
- Institutions and companies for data access and resources to speed up the development.
- Providers of cloud and remote computing resources.

I.

THE PYPSA MEETS
EARTH INITIATIVE

II.

THE PYPSA-AFRICA
PROTOTYPE
PRESENTATION

III.

DEALING WITH
MISSING DATA

I.

**INFRASTRUCTURE
DETECTION**



II.

**DEMAND
PREDICTION**

World Bank & Development
Seed



World Bank & Development
Seed



World Bank & Development Seed



World Bank & Development Seed



World Bank & Development Seed



World Bank & Facebook

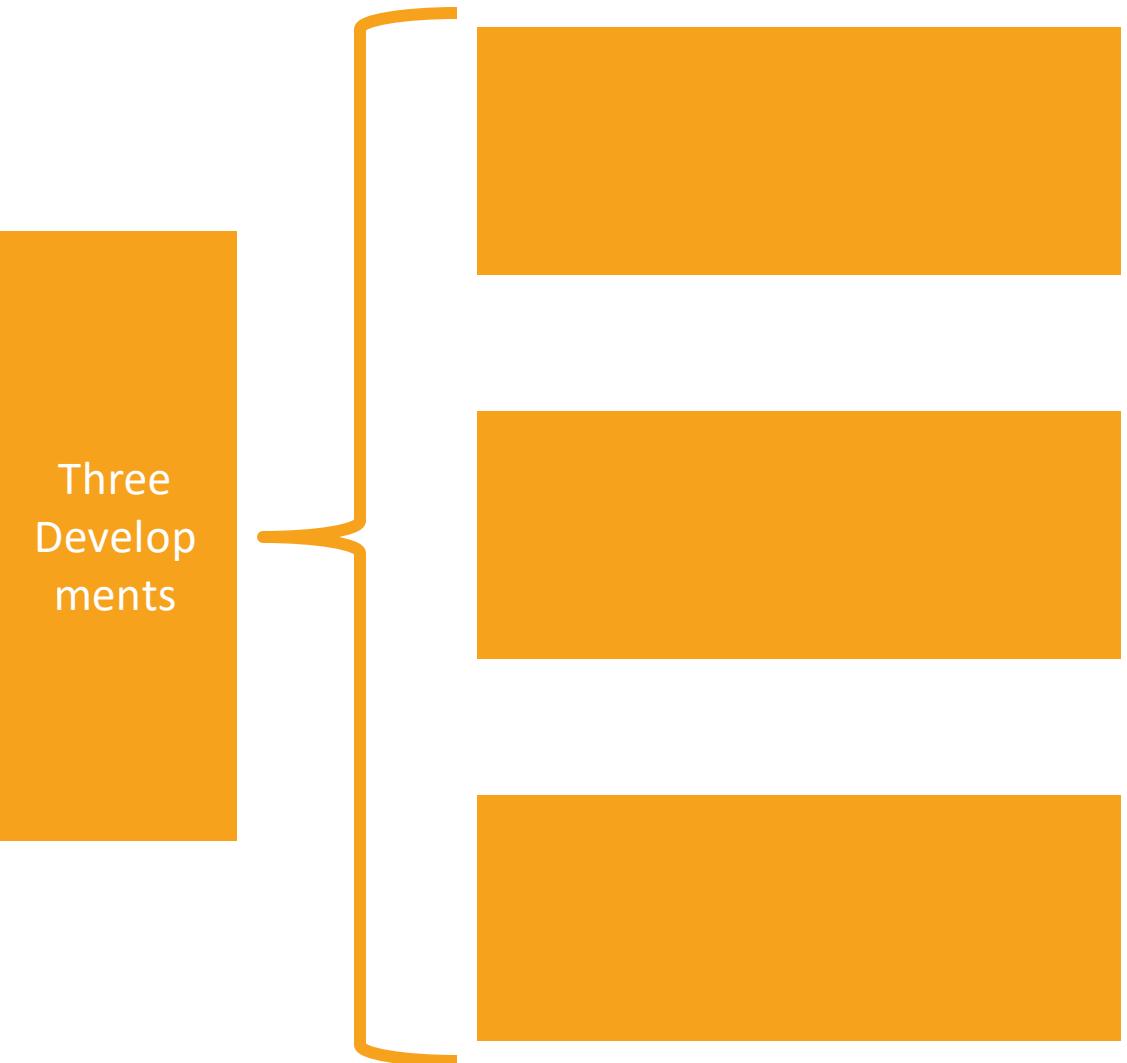


World Bank & Development Seed



World Bank & Facebook





Three Developments

Grid Infrastructure Dataset by Duke University



Three Developments

Grid Infrastructure Dataset by Duke University

Satellite Imagery released by maxar for humanitarian purposes

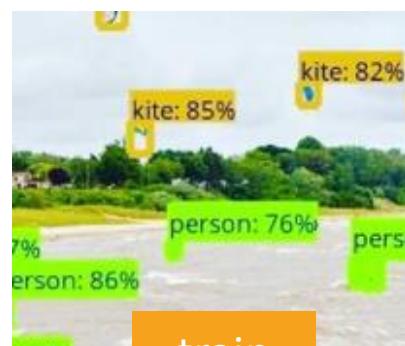


Three Developments

Grid Infrastructure Dataset by Duke University

Satellite Imagery released by maxar for humanitarian purposes

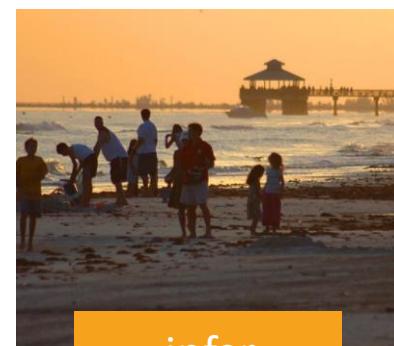
Research advances in machine learning



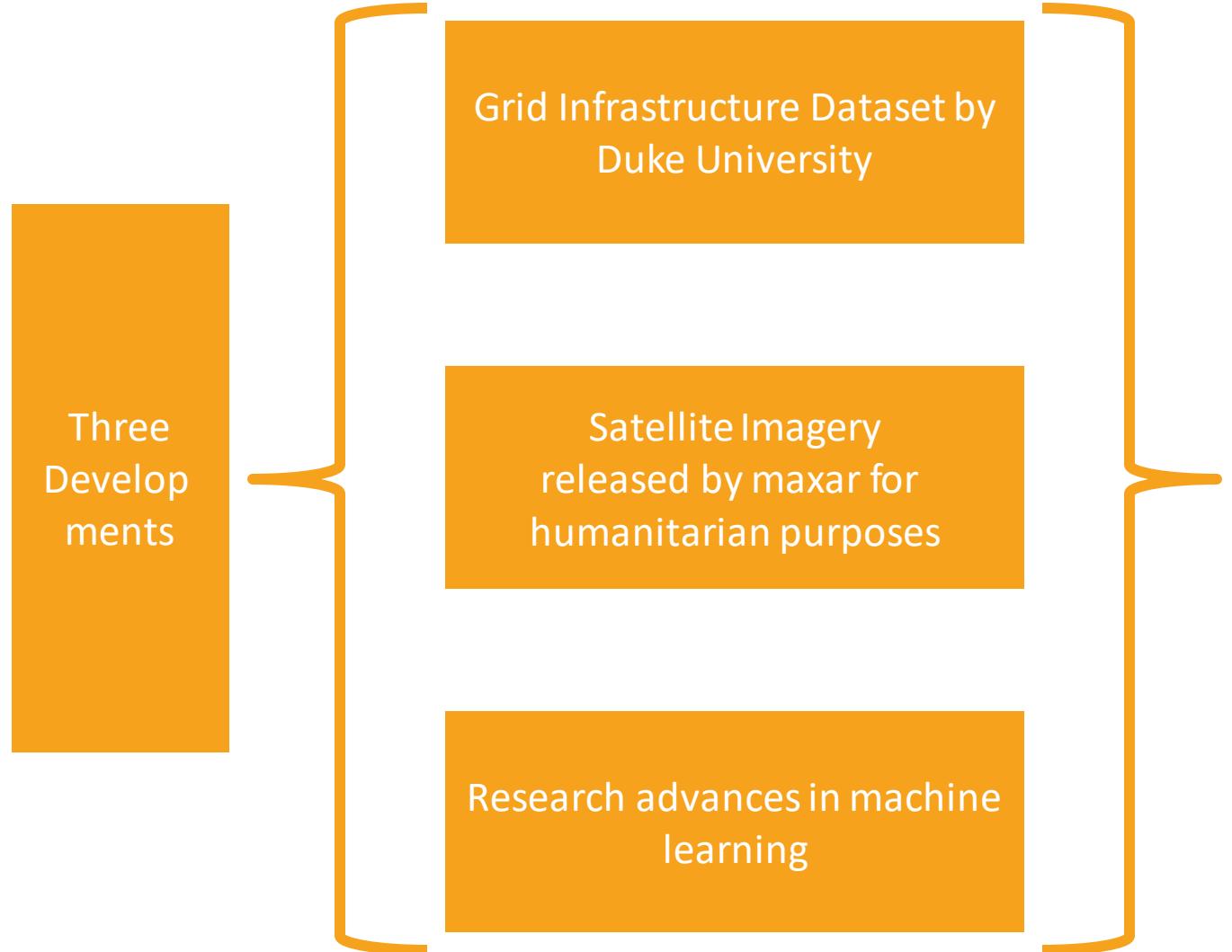
train

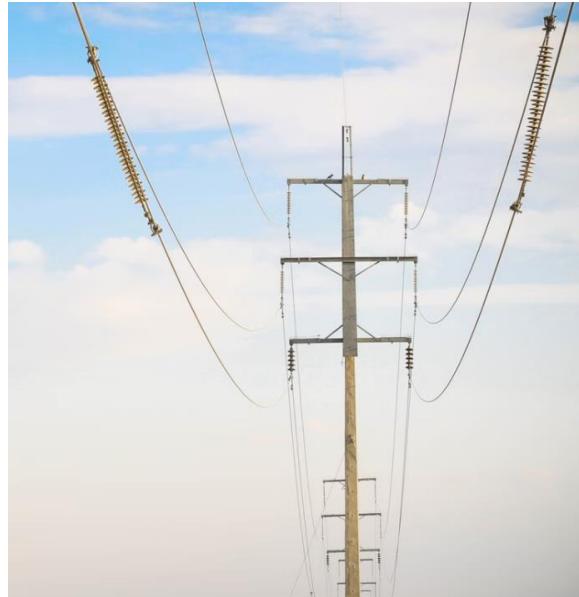


transfer



infer





The PyPSA meets Africa detect-energy team
welcomes support:

- Machine learning engineers, data scientists and Python developers.
- Cloud credits for computation and data storage.
- High-level insights from NGOs, governmental entities and project developers.

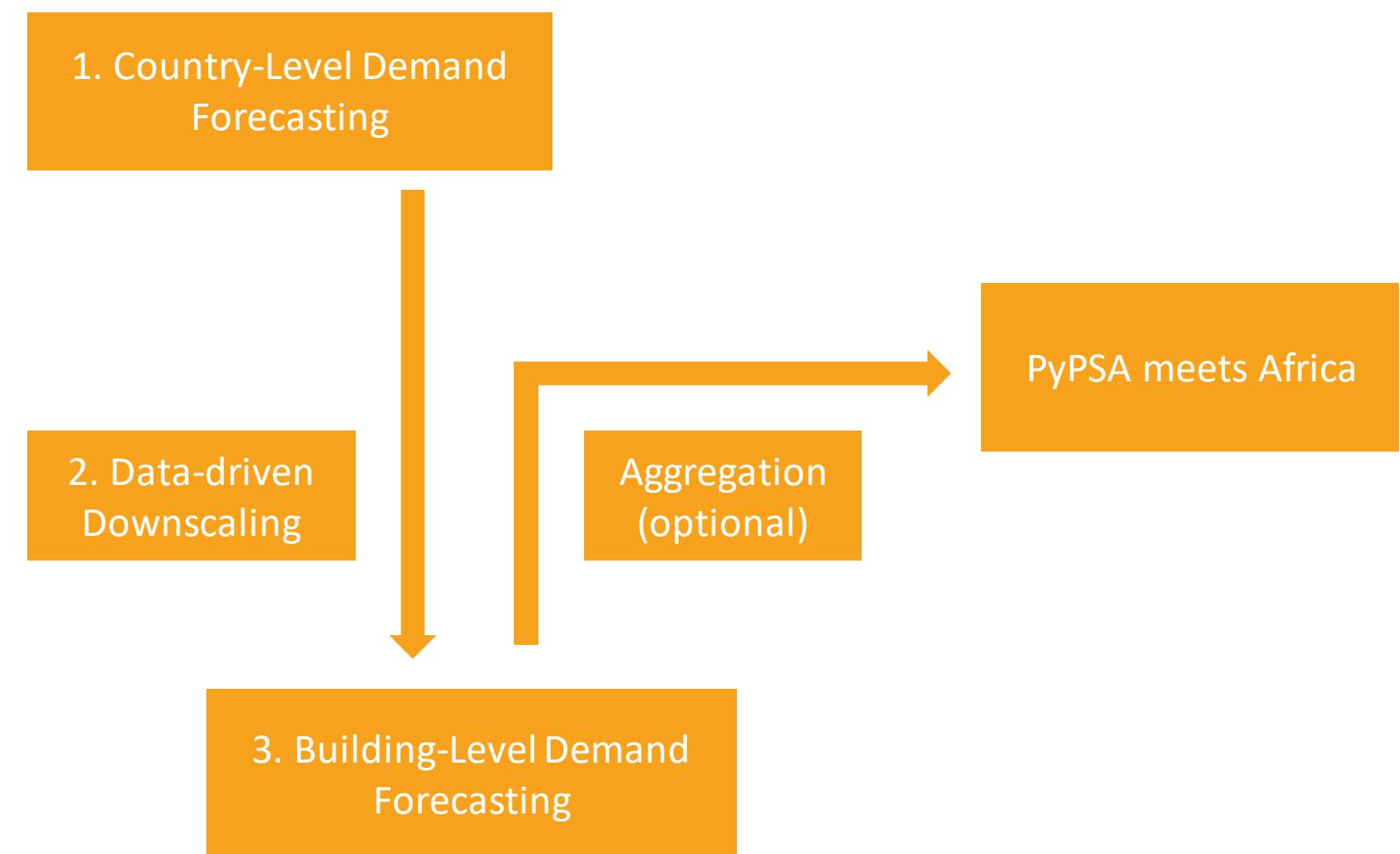
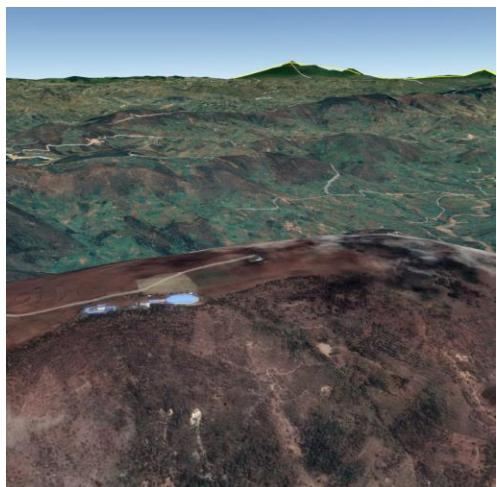
I.

**INFRASTRUCTURE
DETECTION**



II.

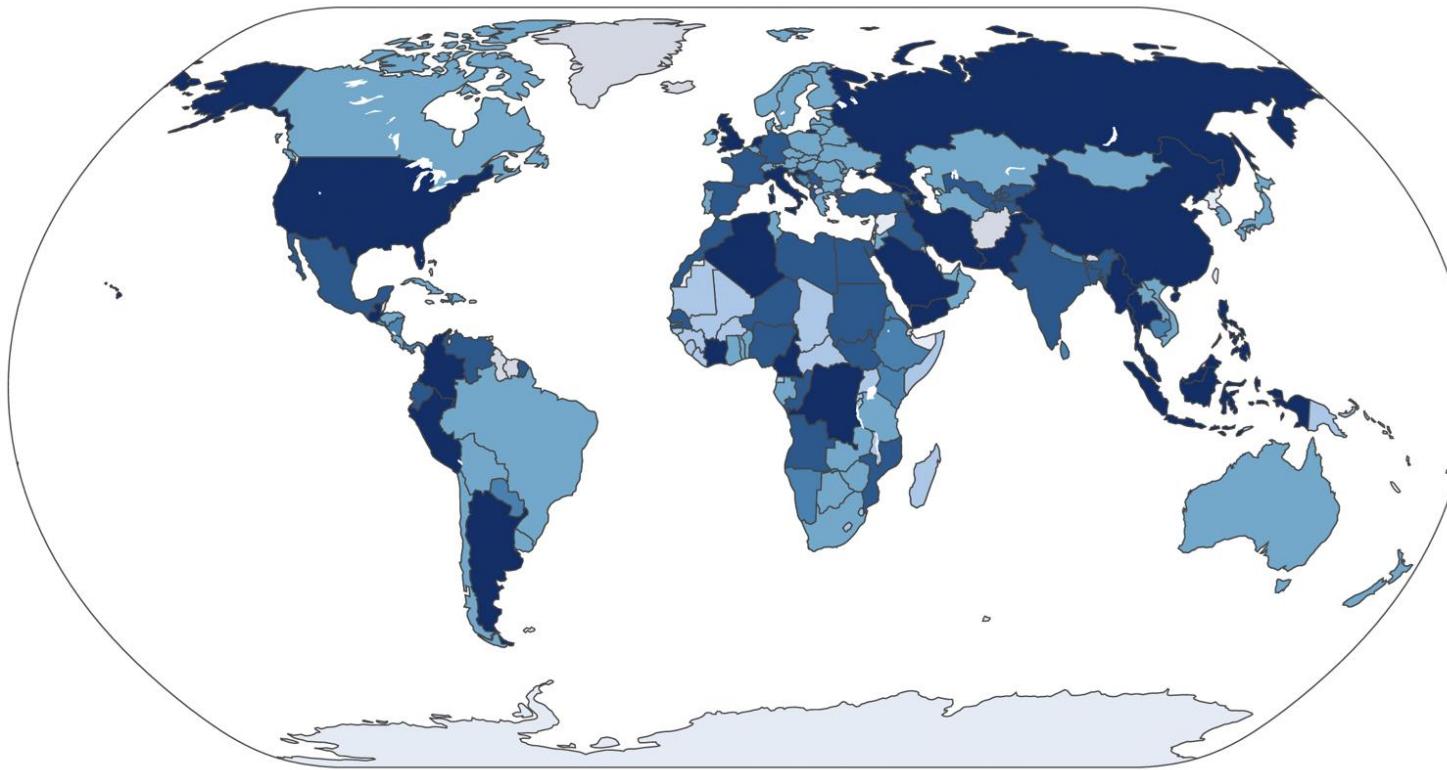
**DEMAND
PREDICTION**



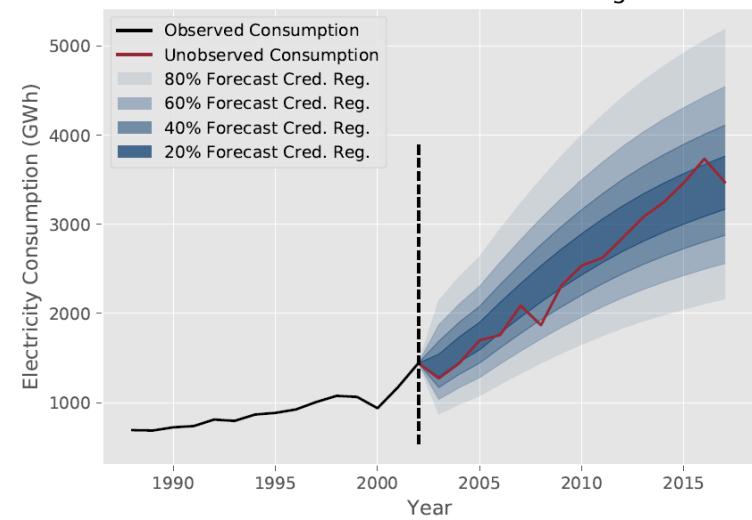
1. Country-Level Demand Forecasting via Bayesian Deep Learning and Others

Features Available

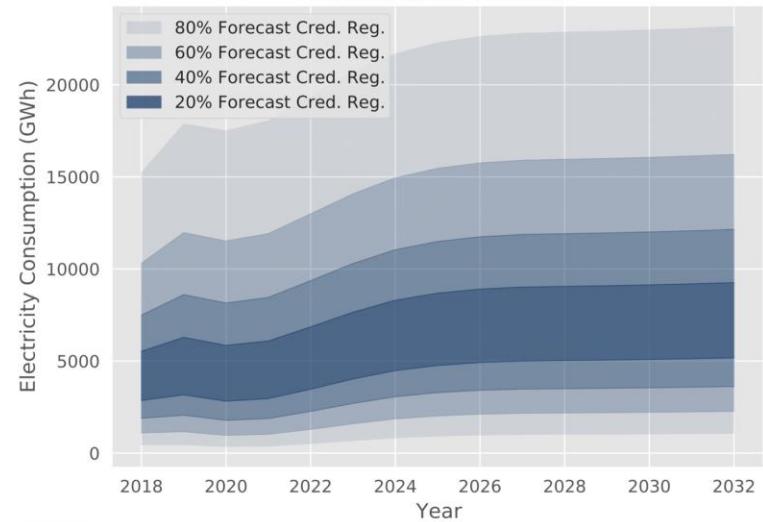
- Elec. Cons., GDP p.c., Pop., Heat Deg. Days, Cool Deg. Days, Renew. Prod., Nat. Gas Net Exp., Coal Net Exp., Nat. Gas Prod., Coal Prod., Elec. Prod., Bat. Deaths, Oil Prod., Oil Net Exp.
- Elec. Cons., GDP p.c., Pop., Heat Deg. Days, Cool Deg. Days, Renew. Prod., Nat. Gas Net Exp., Coal Net Exp., Nat. Gas Prod., Coal Prod., Elec. Prod., Bat. Deaths, Oil Prod.
- Elec. Cons., GDP p.c., Pop., Heat Deg. Days, Cool Deg. Days, Renew. Prod., Nat. Gas Net Exp., Coal Net Exp., Nat. Gas Prod., Coal Prod., Elec. Prod., Bat. Deaths, Oil Prod.
- Elec. Cons., GDP p.c., Pop., Heat Deg. Days, Cool Deg. Days, Renew. Prod., Nat. Gas Net Exp., Coal Net Exp., Nat. Gas Prod., Coal Prod., Elec. Prod.
- GDP p.c., Pop., Heat Deg. Days, Cool Deg. Days
- GDP p.c., Pop.



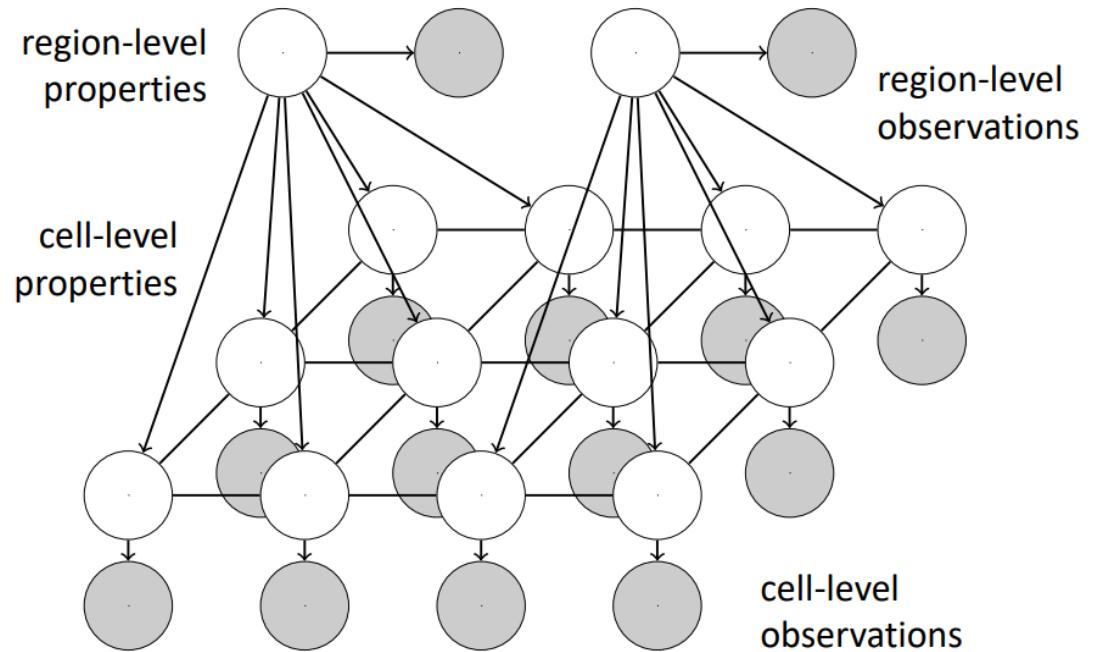
Forecast Model Backtest for Senegal



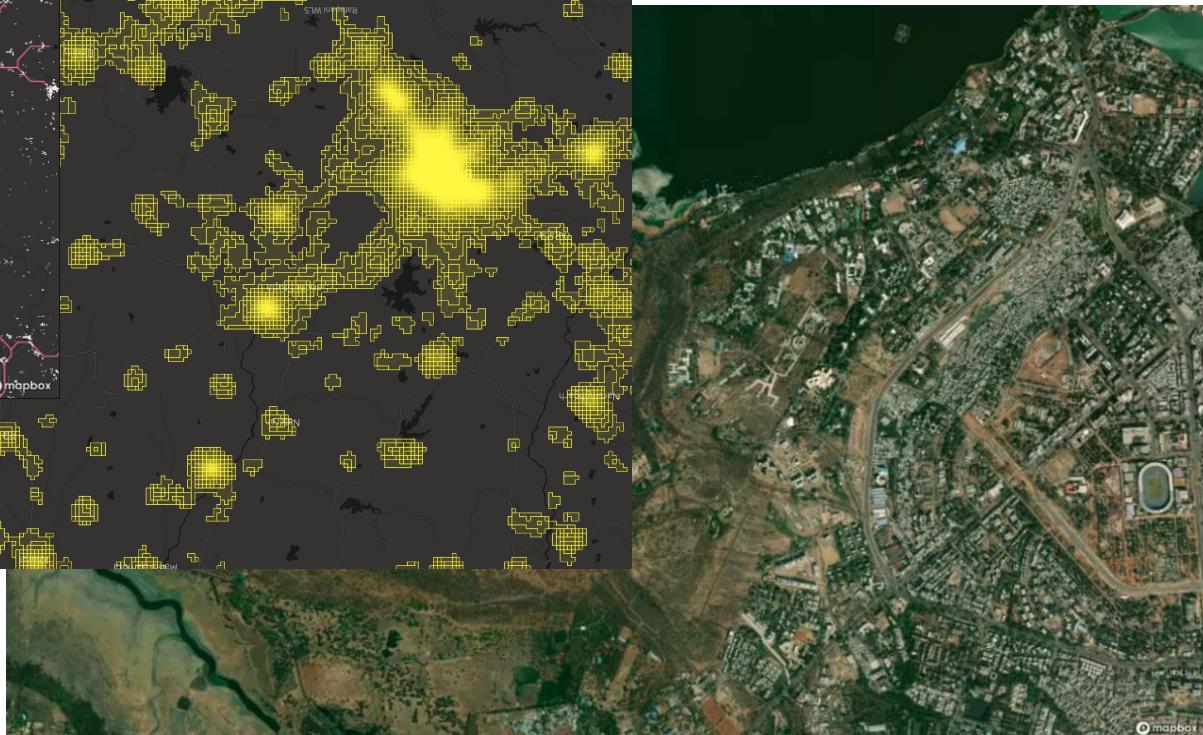
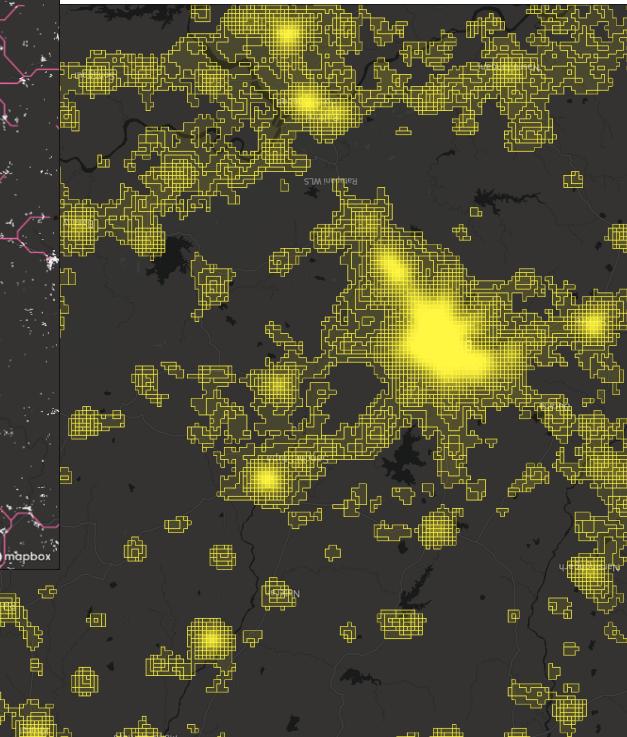
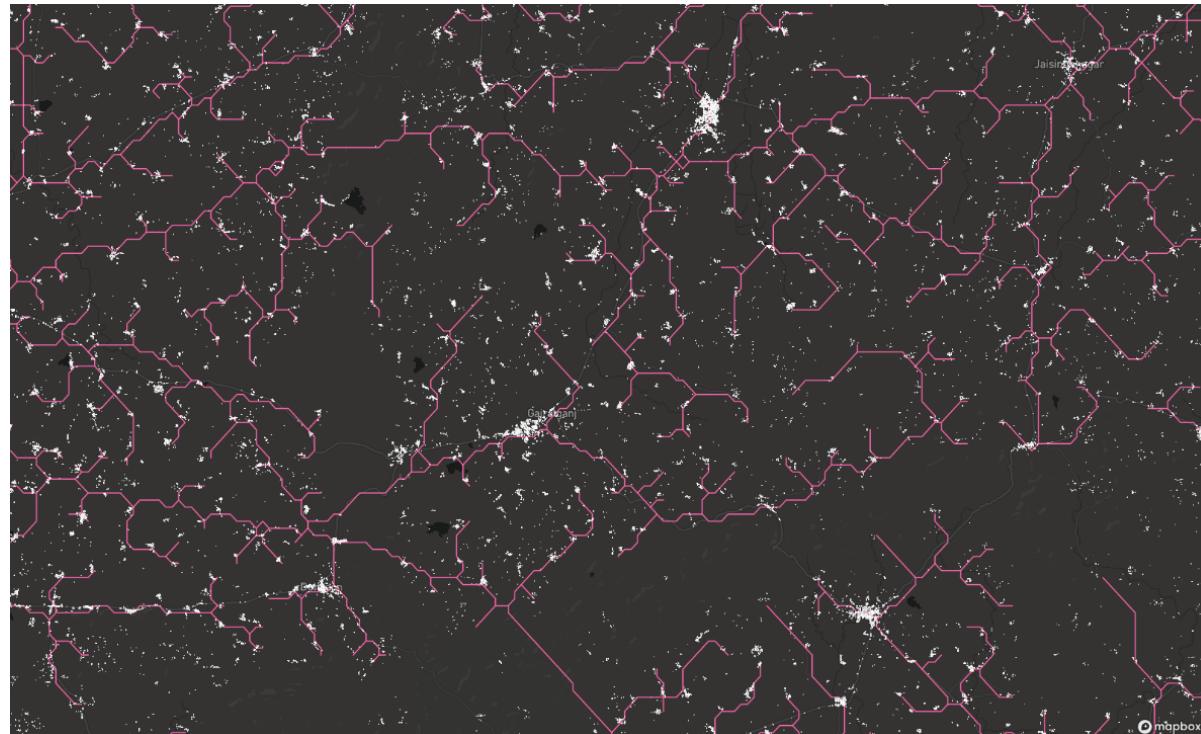
Forecasts for Burundi



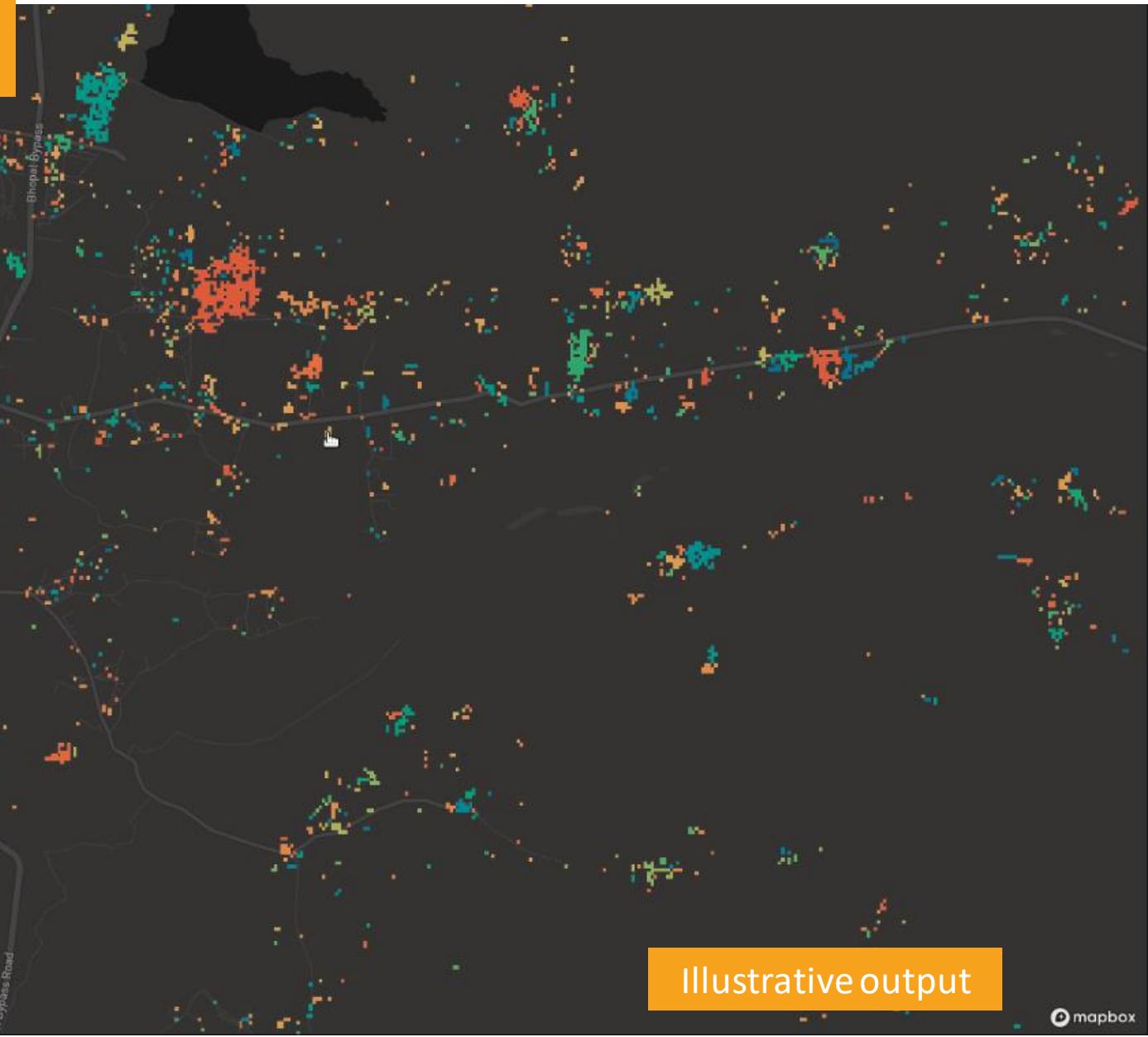
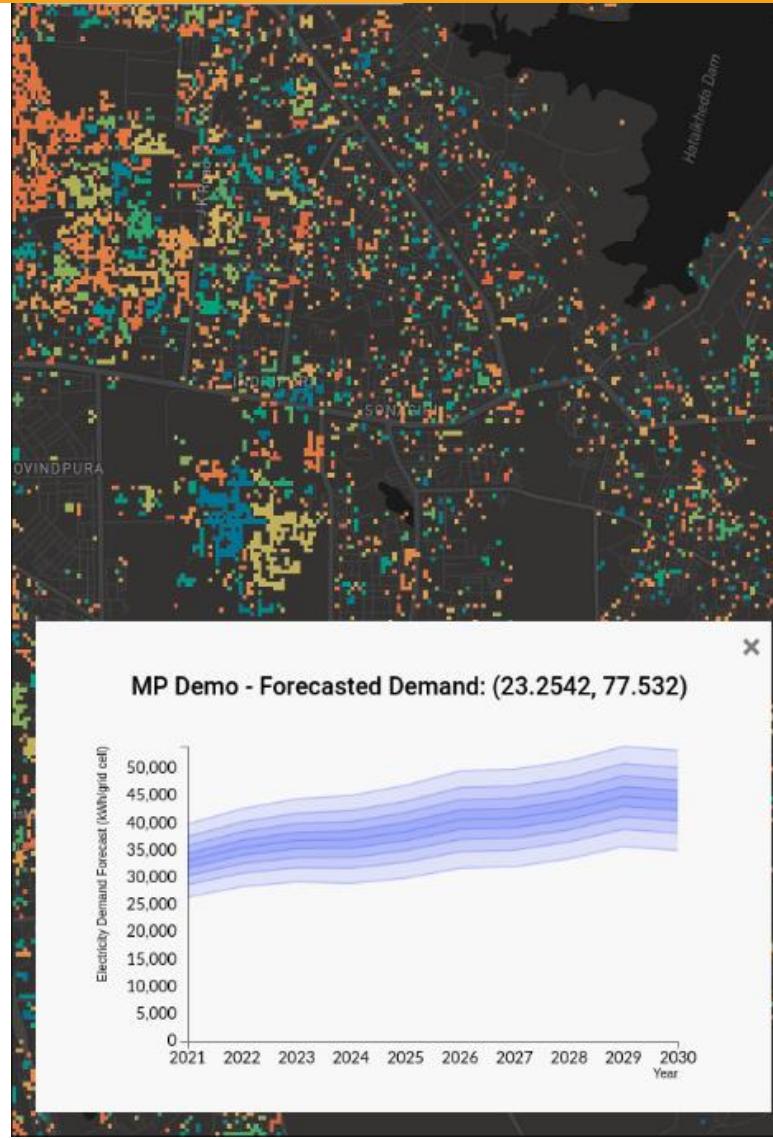
2. Downscaling via Economics-Informed Probabilistic Models and Others

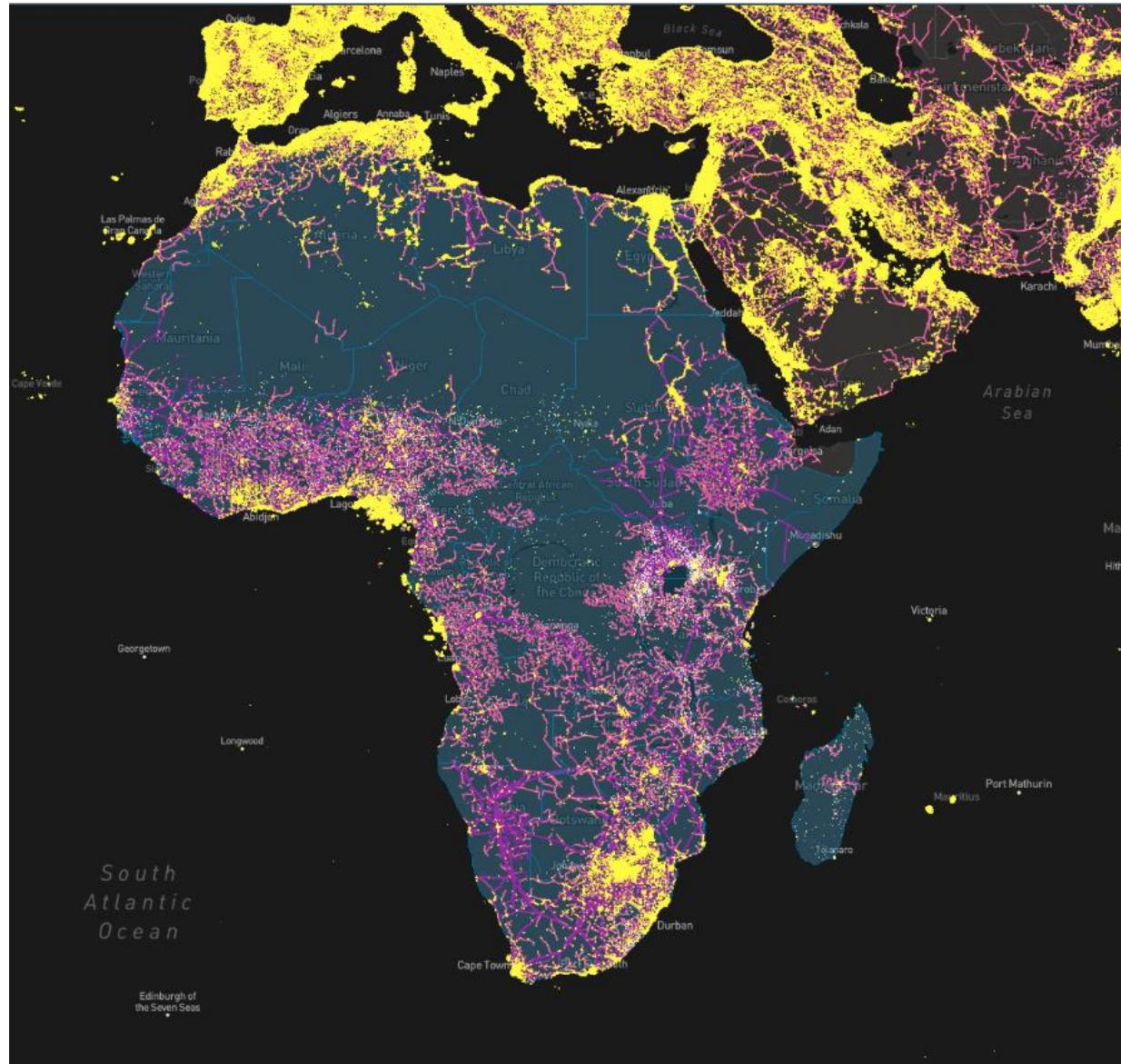


3. Building-Level Demand Forecasting via Bayesian Deep Learning and Others



3. Building-Level Demand Forecasting via Bayesian Deep Learning and Others





What the PyPSA meets Africa demand team is looking for:

- GIS analysts, data scientists, machine learning engineers and researchers, frontend developers, backend developers.
- African agricultural experts, energy policy analysts, climate change analysts.
- Cloud credits for hosting tile servers.
- Collaborations with African governments, utilities, NGOs, and project developers for:
 - Ground-truth validation of results
 - Open-sourcing anonymized consumption data
 - Other beneficial uses of electricity demand forecasts.

I.

THE PYPSA MEETS
EARTH INITIATIVE

II.

THE PYPSA-AFRICA
PROTOTYPE
PRESENTATION

III.

DEALING WITH
MISSING DATA

IV.

HOW TO GET INVOLVED
IN OUR EARTH-MISSION

JOIN OUR TEAM!

Our initiative has 61 members...

- **26 coders**
- **27 advisors**
- **9 communicators**
- **14 PhD students**
- **9 professors**
- **13 energy professionals**
- **...students, postdocs, scientists...**



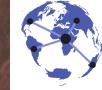
...associated to:



WHY PEOPLE JOIN US?

- **Creating impact**
- **Solve your energy problem**
- **Learn and apply methods**
- **Work together**
- **What is your motivation?**

HOW PEOPLE JOIN US

- **As a hobby**
- **Use  PyPSA meets Earth for your work**
- **Fund dedicated positions (coming)**

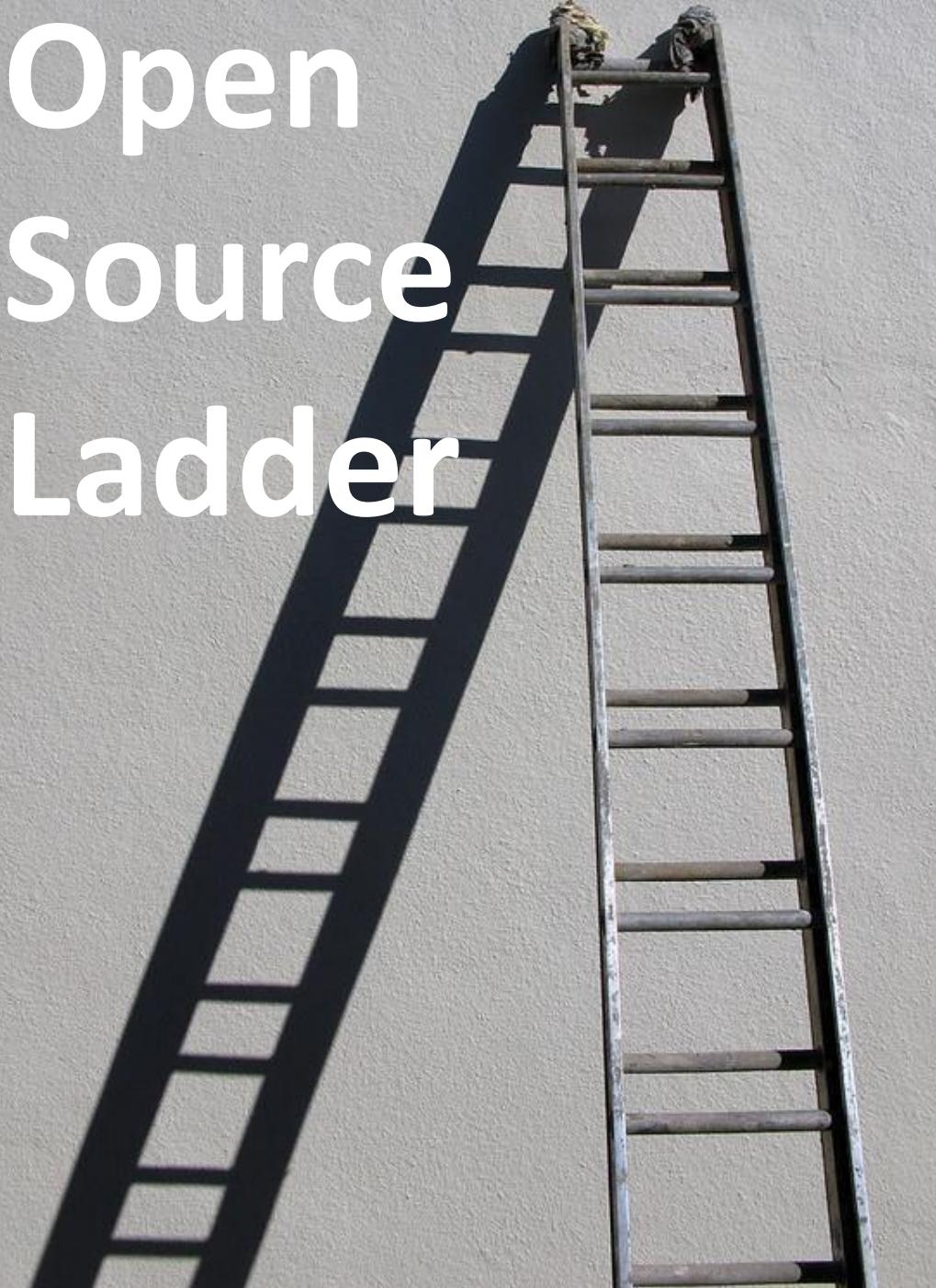
OUR WISHLIST

OR: WHAT WE NEED TO CONTINUE

- Contribute new open data and methods
- Expand and validate model in your region
- Participate and share your ideas
- Join or lead an open data campaign
- Join or lead a code team

Open Source Ladder

"up and down the ladder" by Robert Couse-Baker is licensed under [CC BY 2.0](#)



I.

**THE PYPSA MEETS
EARTH INITIATIVE**

II.

**THE PYPSA-AFRICA
PROTOTYPE
PRESENTATION**

III.

**DEALING WITH
MISSING DATA**

IV.

**HOW TO GET INVOLVED
IN OUR EARTH-MISSION**

Q&A
15min

V.

PANEL DISCUSSION
**"THE ENERGY SYSTEM
MODELLING CHALLENGES
AND OPPORTUNITIES OF
THE 21 CENTURY"**

Q&A
15min

"Energy system modelling challenges and opportunities of the 21 century"

CLAYTON
BARROWS



SENIOR RESEARCH ENGINEER AT NREL, AND TECHNICAL CO-LEAD ON THE OPEN DATA AND **TOOLS PILLAR OF THE GLOBAL POWER SYSTEMS TRANSFORMATION CONSORTIUM (G-PST)**

ASAMI
MIKETA



SENIOR PROGRAMME OFFICER, POWER SECTOR **INVESTMENT PLANNING AT INTERNATIONAL RENEWABLE ENERGY AGENCY (IRENA)**

JARRAD
WRIGHT



PREVIOUSLY, PRINCIPAL GRID **PLANNING ENGINEER AT CSIR IN SOUTH AFRICA AND SOON TO JOIN NREL AS SENIOR RESEARCHER**

MAXIMILIAN
PARZEN



DIRECTOR OF PYPSA MEETS EARTH INITIATIVE AND PHD STUDENT AT UNIVERSITY OF EDINBURGH





PYPSA MEETS EARTH

2022 GETTING READY TO CHANGE THE WORLD



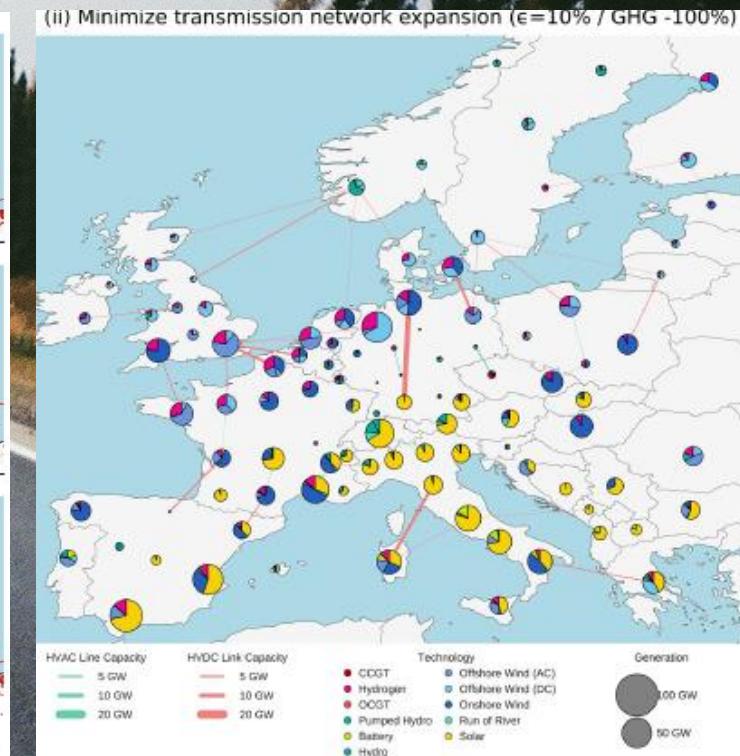
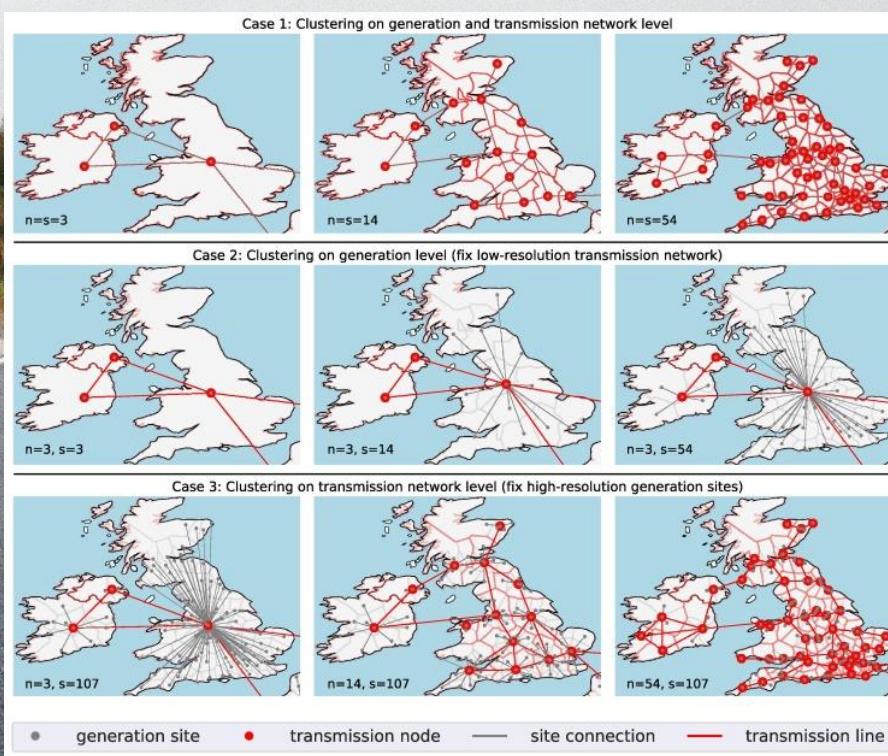
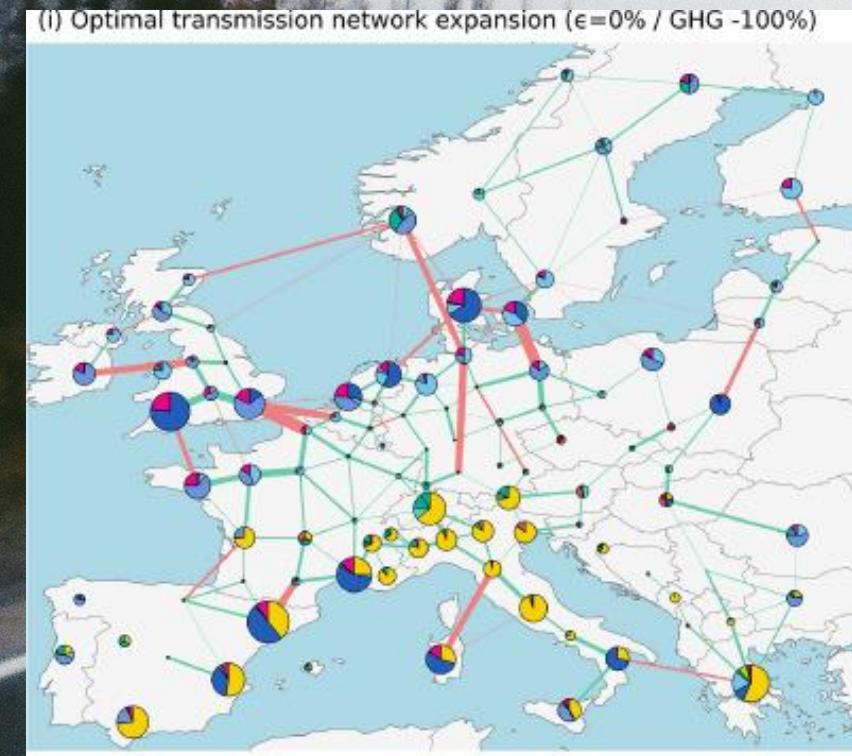




DRAFTS/BACK-UP

WHAT IS POSSIBLE?

- POLICY RECOMMENDATIONS
- ENERGY TRANSITION PLANS
- GRID EXPANSION STUDIES
- GENERATION EXPANSION STUDIES
- TECHNOLOGY EVALUATIONS
- ...



INFLUENCE DECISION MAKING - CASA INDIA

VISION



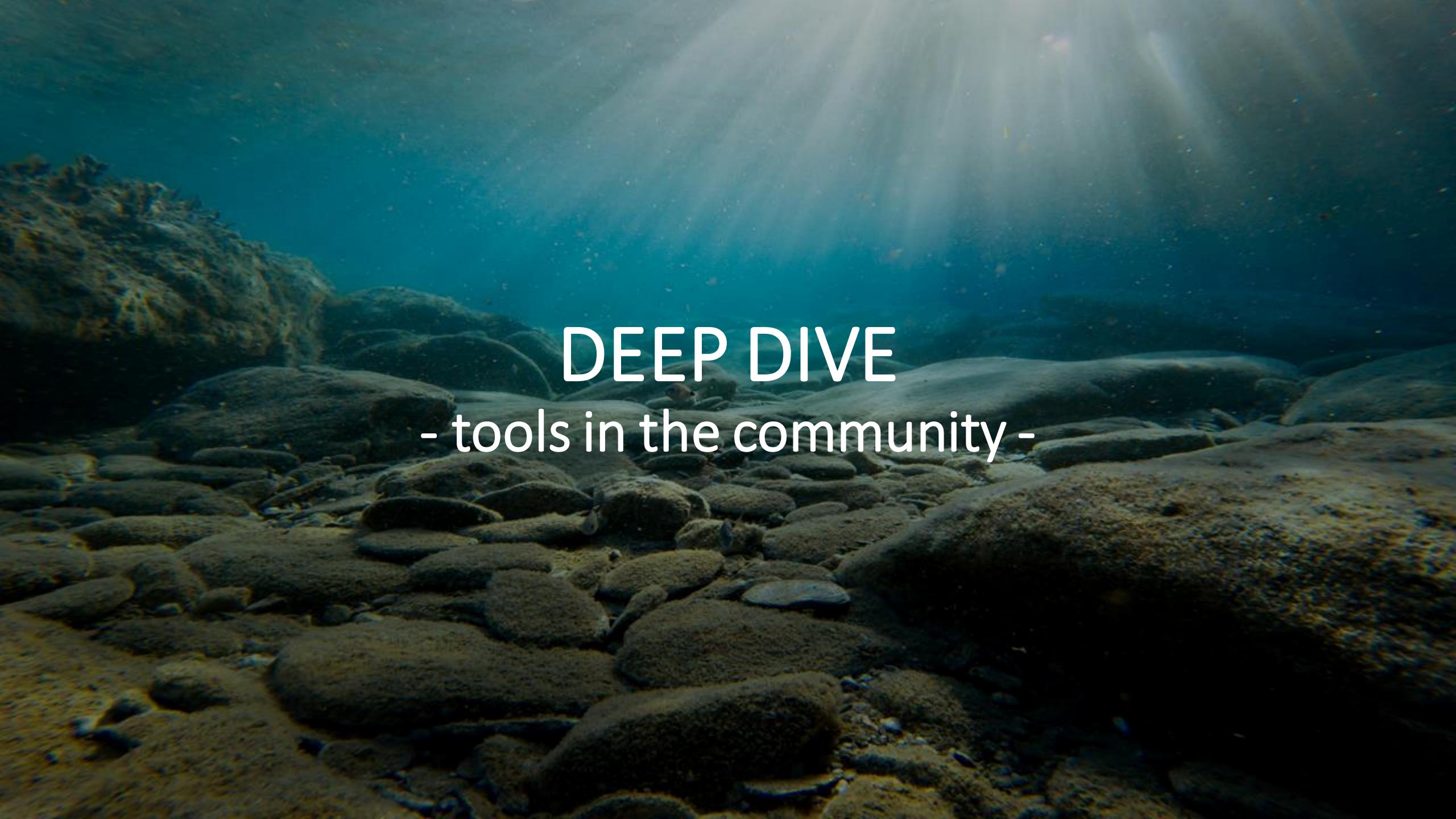
Create **TOGETHER** useful alternatives
to closed-source energy system models
for **industry** and **research**

MISSION

#PyPSA-AFRICA2021

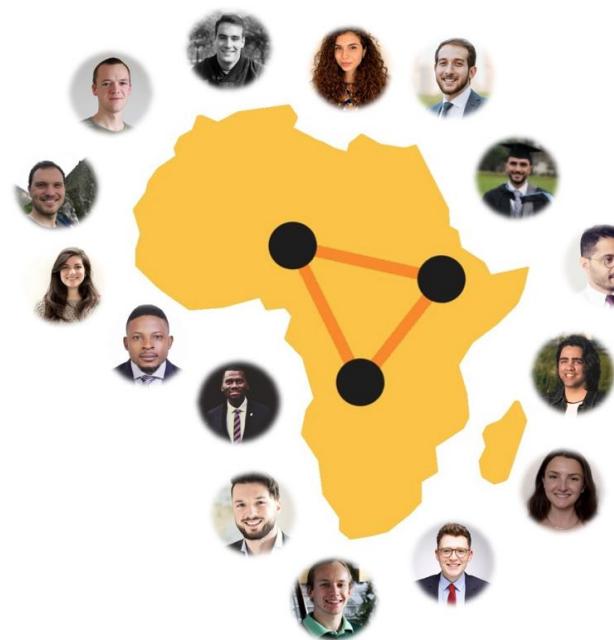
#PyPSA-EARTH2022

#...?

The background of the image is an underwater scene. Sunlight filters down from the surface in bright rays, illuminating a rocky seabed. The rocks are various shades of brown, tan, and grey, some covered in small green plants or algae. The water is slightly hazy, particularly towards the top of the frame.

DEEP DIVE

- tools in the community -



PyPSA

meets Africa

SOLVER

PROBLEM
FORMULATOR

DATA
WORKFLOW

DATA
CREATION

UX/UI

@LINOPY

@SMS++

@PIPS-IPM++

@PYPSA

@PYPSA-AFRICA

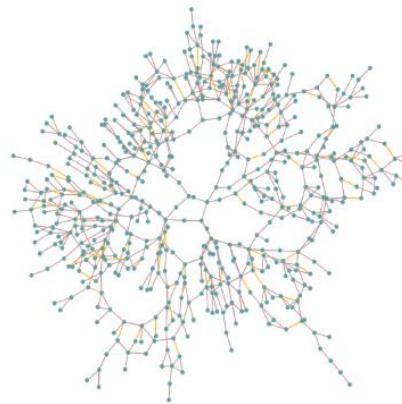
@PYPSA-EUR

@PYPSA-EUR-SEC

@ATLITE

@PYPSA-AFRICA

@ALL
@PYAM



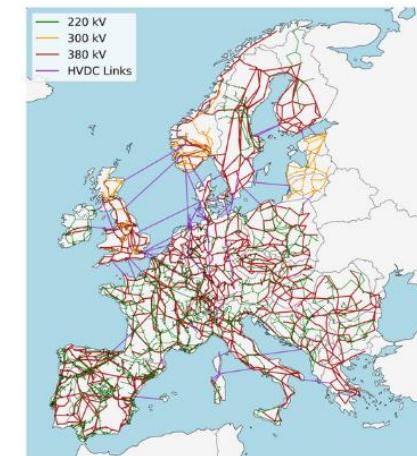
PyPSA

A python software toolbox for simulating and optimising modern power systems.



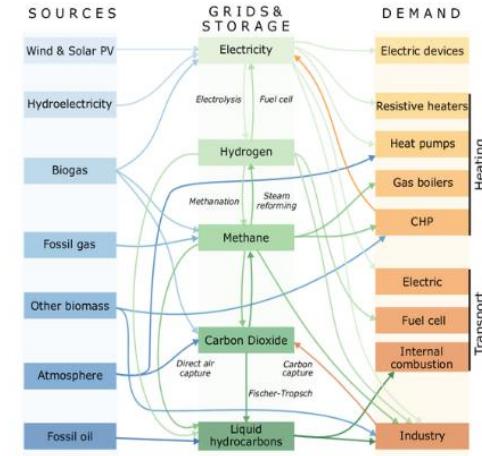
Atlite

A Lightweight Python Package for Calculating Renewable Power Potentials and Time Series



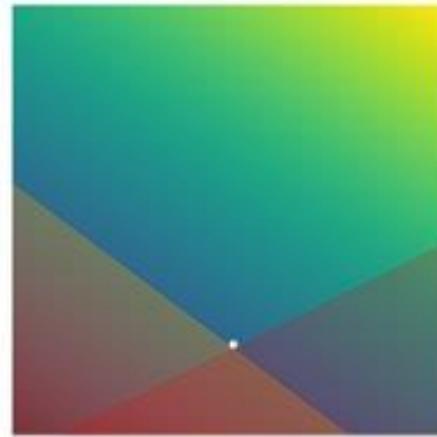
PyPSA-Eur

An open optimisation model of the European transmission system.



PyPSA-Eur-Sec

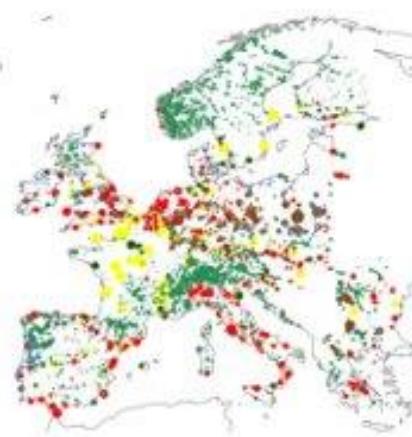
A sector-coupled open optimisation model of the European energy system.



Linopy

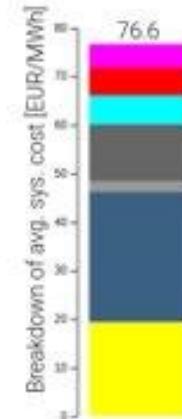
Linear optimization interface
for N-D labeled variables.

[Documentation →](#)



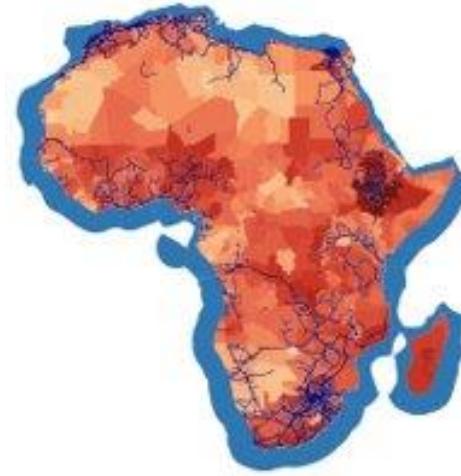
Powerplantmatching

A toolset for cleaning,
standardizing and combining
multiple power plant
databases.



Model Energy

An online toolkit for
calculating renewable
electricity supplies.



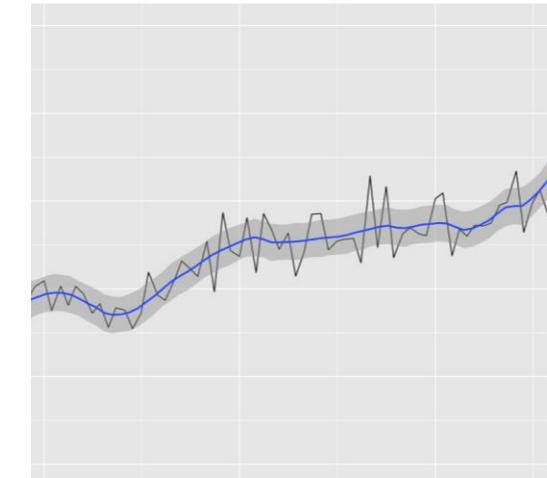
PyPSA-Earth

A highly flexible sector-coupled energy system model of the global energy system



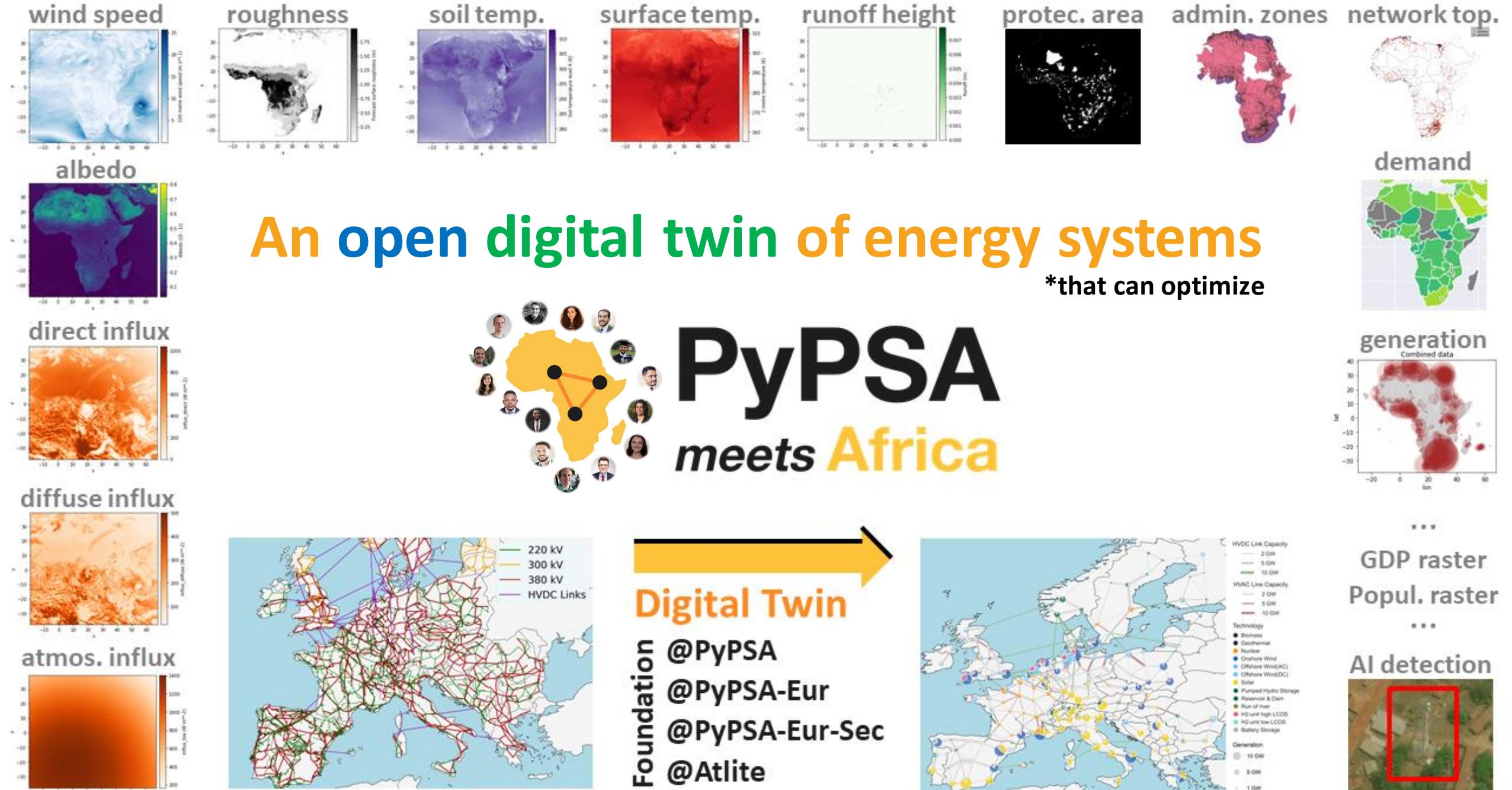
Detect-Energy

A machine learning framework to detect energy assets from satellite images



Demand-Creator

A general framework to create demand timeseries in subnational resolution



EMPOWERING PEOPLE



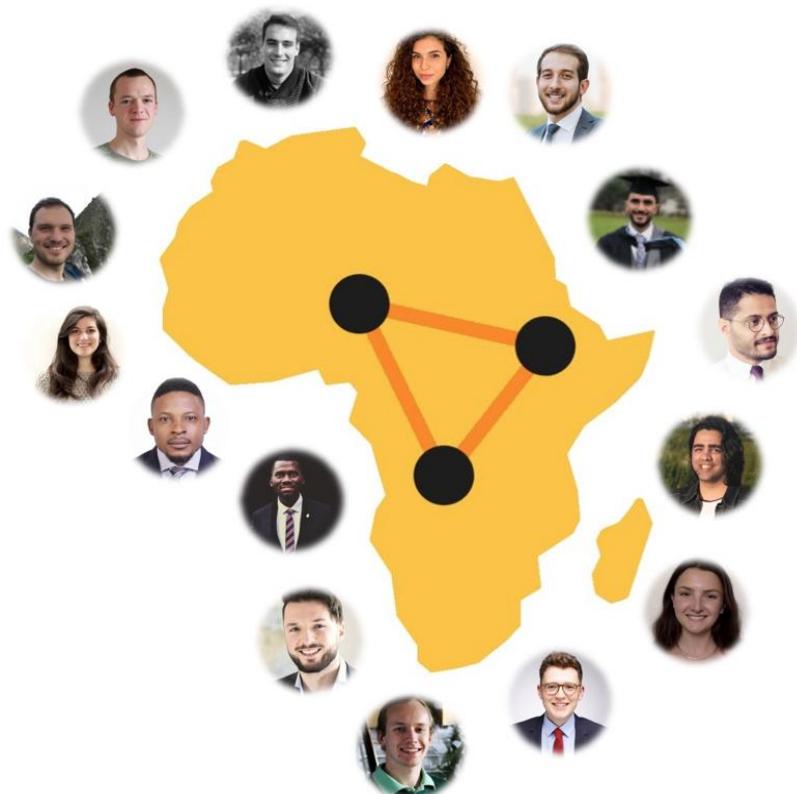


PYPSA MEETS EARTH

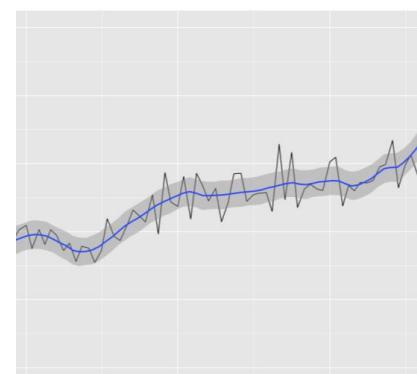
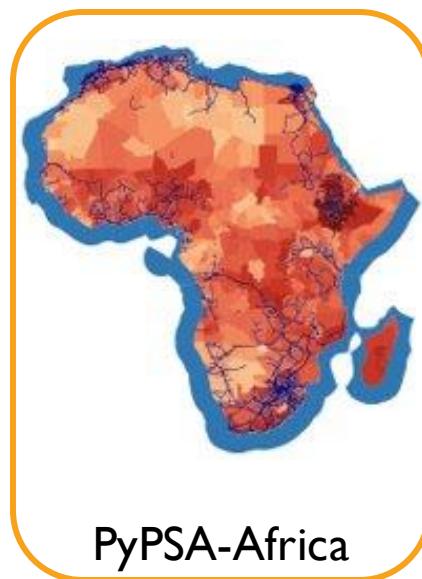
2022 GETTING READY TO CHANGE THE WORLD

DUPLICATION – REMOVAL?

I) Empowering people:
growing community (>60pp)

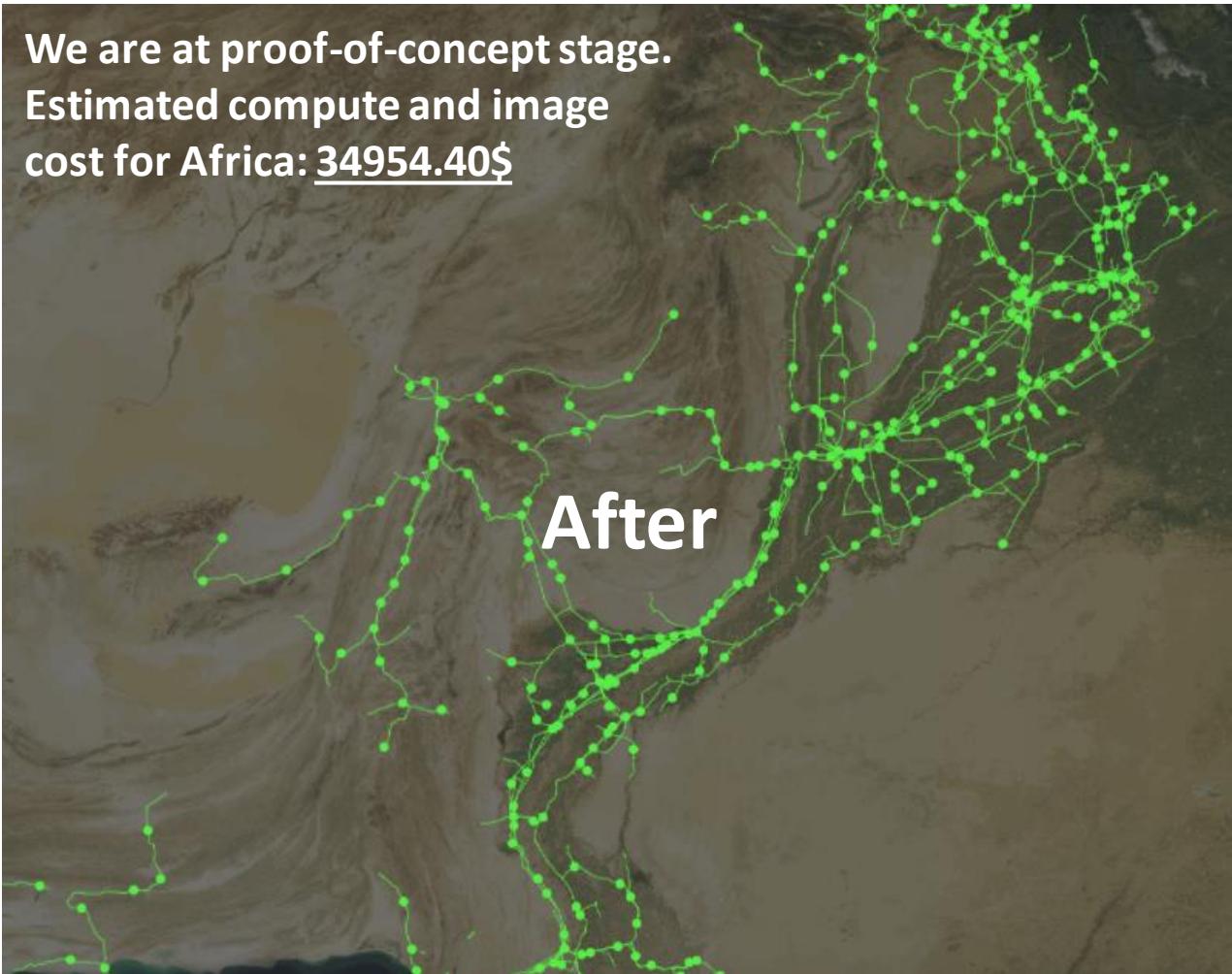


2) Collaborative environment for
answering energy questions
through open tools, solvers and data



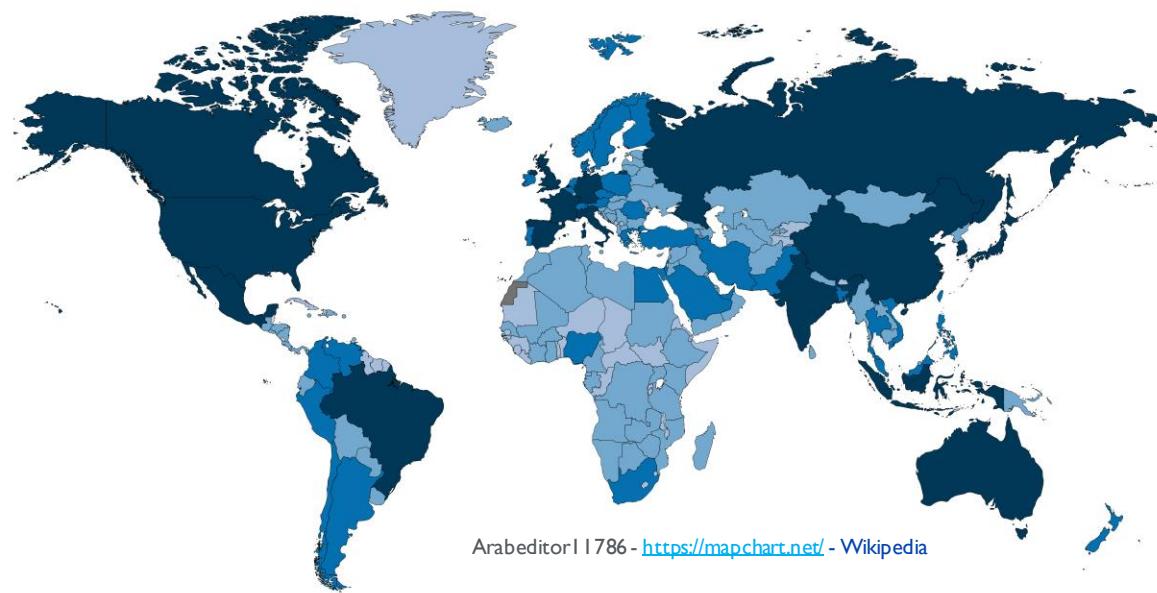
Recent Work

2017: Cooperation between *World Bank* and *Development Seed*

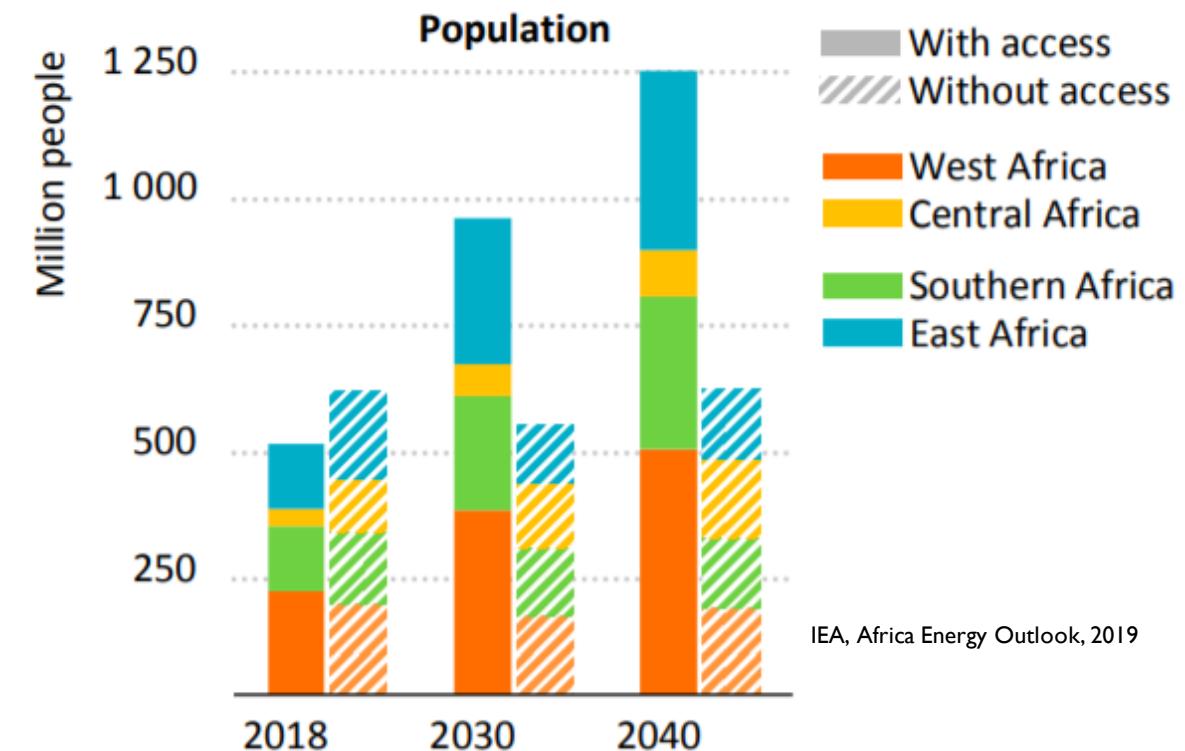


PROBLEM WILL GROW

GDP per capita must increase ...



... and population is growing ...



POWERPLANTS

Datasets to merge:

- Carbon Monitoring for Action (**CARMA**)
- Global Energy Observatory (**GEO**)
- Global Power Plant Database (**GPD**)
- OpenStreetMap (**OSM**)
- ...yours?

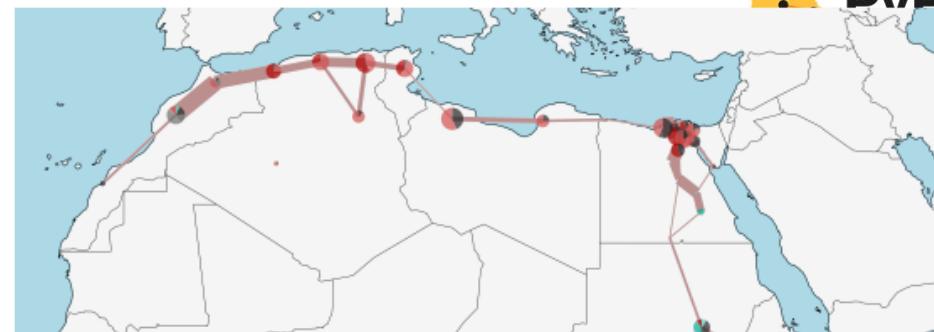


Merge datasets by
Powerplantmatching

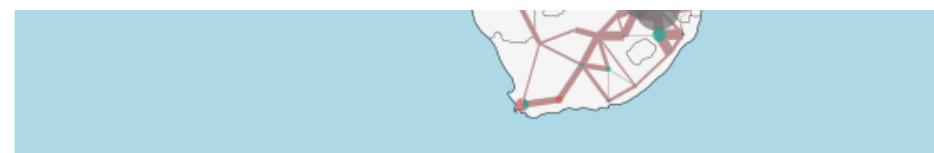
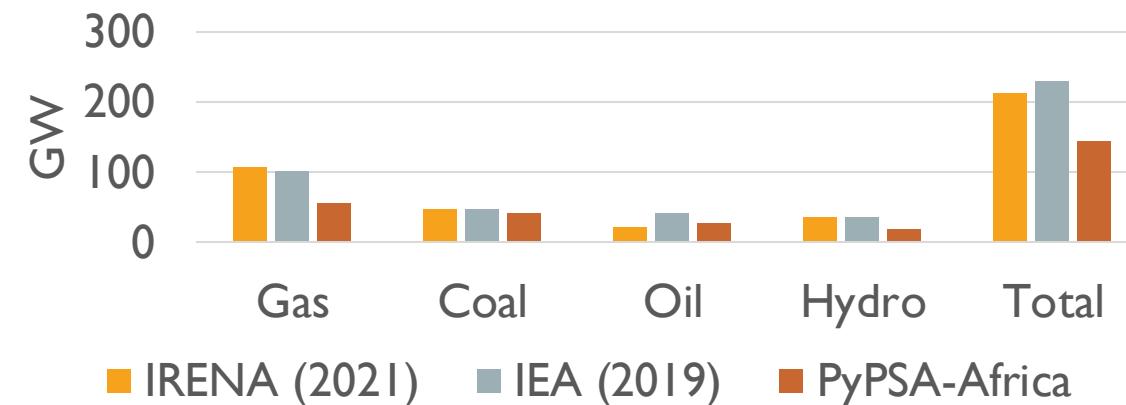


Help welcome on

- Country-level validation
- Merge different datasources (powerplantmatching)
- Look for accurate data



Data validation - Africa



COMPLEXITY AND DATA PROBLEM

WHAT DATA?



Merge and populate data

1. Network data by Open Street Map
2. Powerplant data
3. Resource and demand assessment

DIFFICULT PROBLEM?



Tools to handle complexity

4. Clustering to deal with complexity
5. Network augmentation
6. Some results

PYPSA-AFRICA FEATURES

Policy makers and utilities need:

- **Robust** Built on top of PyPSA-Eur, ...
- **Low cost** Open-source model
- **Reliable** Community support (>60pp)
- **Easy-to-use**  python™
- **Planning & dispatch tools**

Scenario analysis

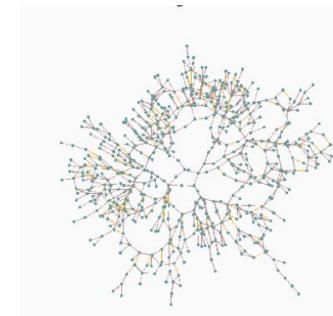
Adjustable resolution

Sector-coupling (coming soon)

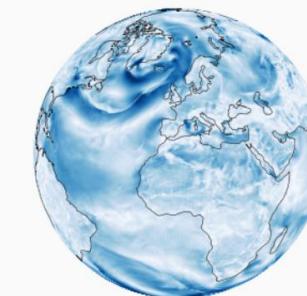


PyPSA
meets Africa

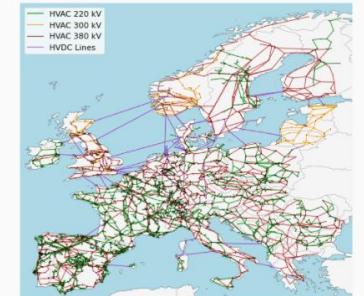
Credits also to



PyPSA



Atlite



PyPSA-Eur

WHAT NEXT

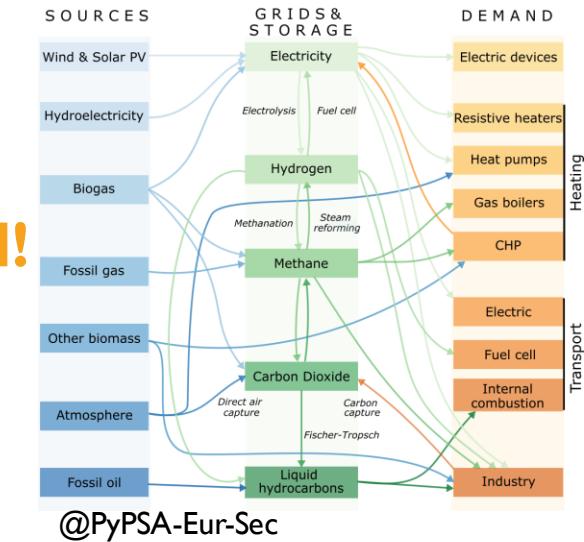
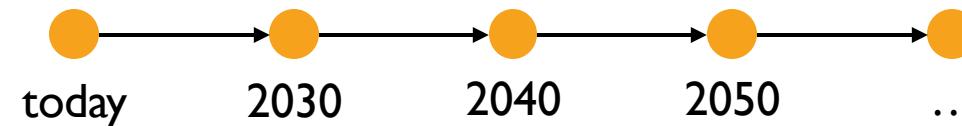
Low data accuracy?

Only electricity?

Single-year?

Ongoing validation!
«Linkers» to use most reliable source

PyPSA Africa Sector coupled!

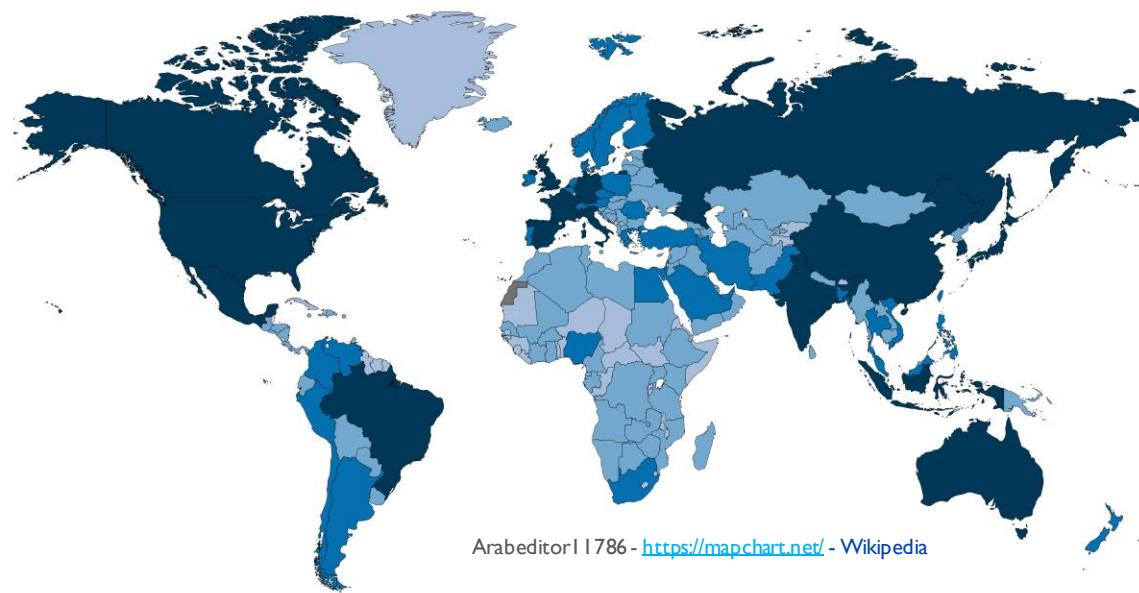


Pathway optimization!



PROBLEM WILL GROW

GDP per capita must increase ...

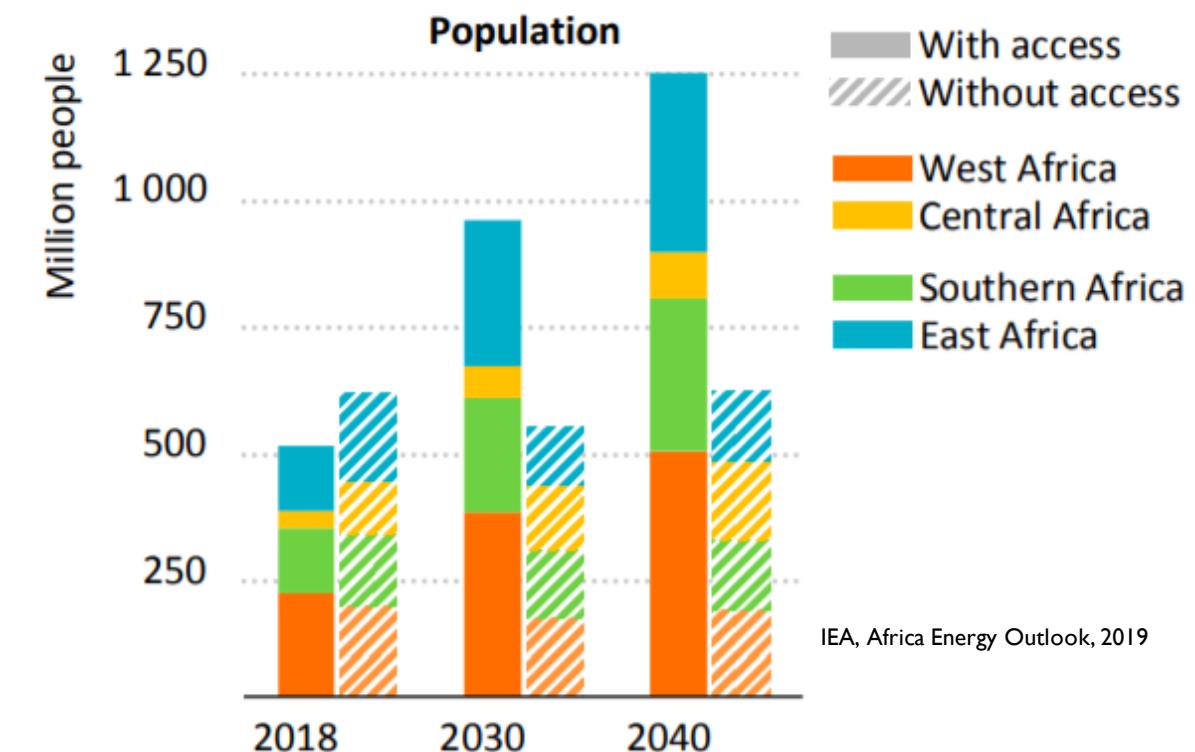


Per capita energy (2019)

<https://ourworldindata.org/grapher/per-capita-energy-stacked>

4

... and population is growing ...



21 MWh/pp

WHAT ARE WE BUILDING?

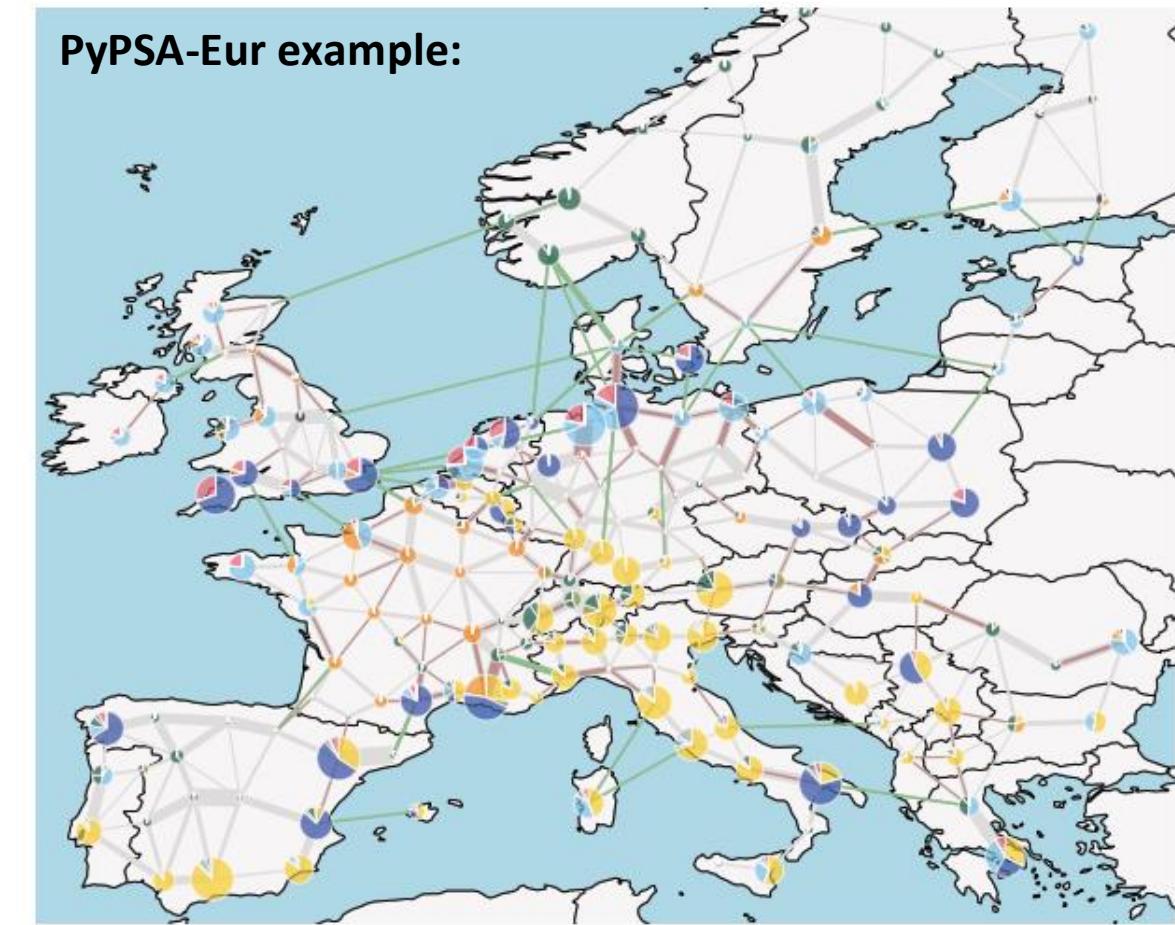
AFRICAN ENERGY SYSTEM MODEL

Special features:

- Investment and dispatch optimisation
- Adjustable resolution and grid modelling
- Multi-horizon opt. (PyPSA-EUR-SEC)
- Sector-coupled (PyPSA-EUR-SEC)

- **Written in Python**
- Modular design with open-source libraries
- Automated, reproducible workflow
- Easy to incorporate new data
- Easy to tailor to different needs
- **Open source down to the source code**

PyPSA-Eur example:



HVAC Line Capacity	HVDC Link Capacity
— 2 GW	— 2 GW
— 5 GW	— 5 GW
— 10 GW	— 10 GW

Technology	Generation
Biomass	● Pumped Hydro Storage
Geothermal	● Reservoir & Dam
Nuclear	● Run of river
Onshore Wind	● H2-unit high LCOS
Offshore Wind(AC)	● H2-unit low LCOS
Offshore Wind(DC)	● Battery Storage
Solar	●
	● 10 GW
	● 5 GW
	● 1 GW