**Resilience Engineering Framework Integration in Off-Grid Renewable Energy Systems**

Candidate Supervisor

Pier Luca Anania Prof. Andrea Micangeli





# **Table of Contents**

1[. Introduction](#_INTRODUCTION)

1.1 [Problem Contextualization](#_1.1_Problem_Contextualization)

1.2 [Purpose and Objectives of the Thesis](#_1.2_Scope_and)

1.3 [Relevance of Resilience Engineering in Minigrids](#_1.3_Relevance_of)

1.4 [Thesis Structure](#_1.4_Thesis_Structure)

[2. Literature Review](#_LITERATURE_REVIEW)

[2.1 Energy Access Context](#_Energy_Access_Context)

2.2 Minigrids Design Overview

2.3 Resilience Engineering: Fundamental Concepts

2.4 EDA Exploratory Data Analysis

2.5 Anomaly Detection: Applications and Methods

3. Methodology

3.1 Description of the study context

3.2 Design and Implementation of the Resilience Engineering Framework

3.3 Methodologies for integrating anomaly detection into the framework

4. Design and Implementation of Anomaly Detection Algorithm

4.1 Algorithm Selection for Anomaly Detection

4.2 Data Collection and Preparation

4.3 Algorithm Implementation

4.4 Exploratory Data Analysis

5.4 Results

5. Evaluation of Minigrid Resilience

5.1 Resilience Indicators

5.2 Resilience Analysis Before and After Implementation

5.3 Results and Interpretation

6. Analysis and Discussion

6.1 Analysis of the results obtained from the application of the integrated framework

6.2 Discussion of theoretical and practical implications

6.3 Limitations and potential improvements

7. Conclusions

7.1 Summary of main results

7.2 Study limitations

7.3 Potential Future Developments

8. Acknowledgments

9. [Bibliography](#_11._BIBLIOGRAPHY)

~~11. Appendices~~

~~11.1 Technical Details of the Anomaly Detection Algorithm~~

~~11.2 Additional Graphs and Tables~~

# **INTRODUCTION**

## 1.1 Problem Contextualization

More than 1.4 billion people worldwide do not have access to electricity. Roughly 85% of these people live in rural areas and a large proportion live in Africa [[1]](#_[1]_International_Energy). To date many utilities and governments have been unable to meet the energy needs of rural areas, as the focus has often been on meeting the demand of major industries or highly-populated urban areas such as the Nigeria’s area in Western Africa or the area around Lake Victoria on the Ugandan side. [[2]](#_[2]_Increasing_Rural)

In the contemporary landscape of energy systems, minigrids have emerged as pivotal infrastructures, particularly in remote or off-grid areas, offering a decentralized and sustainable solution to electricity provision. However, ensuring the reliable operation of minigrids amidst diverse challenges poses a significant concern. Anomalies, ranging from equipment malfunctions to extreme weather events, can disrupt normal operations, leading to service interruptions and potential safety hazards. Addressing these challenges necessitates not only robust anomaly detection mechanisms but also a holistic approach that integrates principles of resilience engineering.



**Fig.1:** Share of the population with access to electricity (2020).

Data compiled from multiple sources by World Bank

An integrated approach utilizing the theoretical and practical principles of Resilience Engineering is crucial in a world of constant change, whether we are talking about phenomena relating to climate change, geopolitical instabilities or simply the reliability of a more or less complex energy system.

Being able to rely on continuous service is crucial in contexts of full electrification (think of the need to service critical infrastructure) as well as in contexts of rural electrification. In a community where the energy supply is tied to a single source and its life and economy depend on it, it is more necessary than ever to define, from the earliest stages, a system capable of overcoming technical, operational and community shortcomings. [[5]](#_[5]_Saeid_Charani)

## 1.2 Purpose and Objectives of the Thesis

The primary objective of this work is to develop a comprehensive understanding of how resilience engineering concepts can inform and improve anomaly detection strategies by leveraging insights from resilience engineering literature and methodologies, this study aims to enhance the robustness and adaptability of anomaly detection algorithms, thereby bolstering the overall resilience of minigrid operations.

Through the analysis of an Open-Source dataset concerning a photovoltaic production plant, an EDA Exploratory Data Analysis and the implementation of an Anomaly Detection algorithm will be carried out in order to highlight critical points in the system.

The aim of this thesis work is to structure a multidisciplinary and multiobjective approach in which the resilience engineering framework is applied to a photovoltaic energy production system. By fostering a deeper understanding of the interplay between resilience engineering and minigrid operations, this research endeavors to inform future strategies for enhancing the reliability and sustainability of decentralized energy systems.

## 1.3 Relevance of Resilience Engineering in Minigrids

Resilience engineering, a paradigm rooted in the fields of safety and systems engineering, emphasizes the ability of systems to adapt and recover from disruptions while maintaining essential functions. By shifting the focus from preventing failures to managing and mitigating their consequences, resilience engineering offers a promising framework for enhancing the performance and reliability of complex systems like minigrids.

The increasing demand for electricity and the need for sustainable energy sources have led to the development of various decentralized energy systems, including minigrids. However, these minigrids are often subject to disturbances and failures, which can have significant impacts on the communities they serve. Resilience engineering, which focuses on the ability of a system to adapt and recover from disturbances, is therefore highly relevant in the context of minigrids. This thesis will discuss the relevance of resilience engineering in minigrids, highlighting its importance in ensuring the sustainability and reliability of these energy systems.

Resilience engineering is a proactive approach to engineering that focuses on the ability of a system to anticipate, respond to, and recover from disturbances and failures [[6]](#_[6]_Hollnagel_et). It recognizes that disturbances are inevitable and that the goal is not to prevent them but to manage them in a way that minimizes their impact.

Minigrids, on the other hand, are small-scale, decentralized electricity distribution systems that serve a limited geographical area. They are often used in remote or rural areas where there is no access to the centralized grid. Minigrids can be powered by various energy sources, including fossil fuels, renewable energy, or a combination of both.

The relevance of resilience engineering in minigrids can be seen in several ways:

*Improved System Reliability*: Minigrids are often the sole source of electricity for the communities they serve. Any disruption in the supply of electricity can have significant impacts on the community's social and economic well-being. Resilience engineering can help improve the reliability of minigrids by ensuring that they can withstand and recover from disturbances quickly.

*Cost-Effective*: Resilience engineering focuses on managing disturbances rather than preventing them. This approach can be more cost-effective than trying to prevent all disturbances, which can be expensive and often not feasible. By managing disturbances effectively, minigrids can reduce the need for costly repairs and replacements.

*Increased Sustainability*: Resilience engineering can help increase the sustainability of minigrids by ensuring that they can adapt to changing conditions. For example, minigrids that are designed with resilience engineering principles can better adapt to changes in energy demand, climate change, and technological advancements.

*Improved Safety*: Minigrids that are designed with resilience engineering principles can be safer for both the operators and the communities they serve. By anticipating and managing disturbances, minigrids can reduce the risk of accidents and injuries.

Resilience engineering is highly relevant in the context of minigrids. It can help improve the reliability, cost-effectiveness, sustainability, and safety of these energy systems. By focusing on the ability of minigrids to anticipate, respond to, and recover from disturbances, resilience engineering can ensure that minigrids can continue to provide essential electricity services to the communities they serve, even in the face of challenges and uncertainties. As the demand for decentralized energy systems continues to grow, the importance of resilience engineering in minigrids cannot be overstated.

## 1.4 Thesis Structure

The thesis work is organized with an initial review of the existing literature in Chapter 2 to build a solid and up-to-date background. It starts with an analysis of the Energy Access context, aligned with the Sustainable Development Goal (SDG) 7 Energy Access objective. This is followed by a study on the state of the art of minigrids in rural contexts. The components and characteristics useful for the discussion are defined. This is followed by a study of modern methodologies of Resilience Engineering, Exploratory Data Analysis and Anomaly Detection.

Chapter 3 describes the methodology by delving into the study context, the Resilience Engineering framework, and the integration of Anomaly Detection within it.

Chapter 4 addresses the Design and Implementation of the Anomaly Detection Algorithm, detailing the model and the code developed in the Python language.

Chapter 5 examines the Evaluation of Minigrid Resilience through the development of indicators and an impact analysis of the same.

Chapter 6 presents a final analysis and critical discussion of the results obtained, highlighting limitations and potential developments.

The work concludes with acknowledgments in Chapter 8 and the Bibliography in Chapter 9.

# **LITERATURE REVIEW**

## Energy Access Context

### Energy Planning

There is no universal definition of the term “Energy Access.” IEA (2011) gives the following definition: “a household having reliable and affordable access to clean cooking facilities, a first connection to electricity and then an increasing level of electricity consumption over time to reach the regional average.” However, the definition implicitly assumes the regional average level of consumption as the acceptable minimum need which can be problematic due to its potential for encouraging wasteful consumption and perpetuation of unsustainable lifestyles. [[3]](#_[3]_Subhes_C.)

Globally, approximately 759 million individuals, constituting 1 out of every 10 people, lack access to essential electricity for illuminating their homes, preserving perishable food items, or mitigating the effects of escalating temperatures. Roughly 2.6 billion individuals are compelled to resort to polluting biomass sources like charcoal, coal, and animal waste for cooking purposes. These statistics present an intolerable reality.

In Sub-Saharan Africa and Asia, the largest disparities in electricity and clean cooking accessibility are observed across 20 countries. These regions also contribute to the 80 percent of nations worldwide that grapple with inadequate electricity provision. The absence of access to clean, modern energy undermines efforts to achieve Sustainable Development Goals (SDGs) aimed at poverty alleviation, educational enhancement, and public health amelioration. For instance, replacing antiquated stoves and open fires could prevent the deaths of 800,000 children annually, who succumb to indoor air pollution exposure. Hence, the imperative of SDG7 is to address these energy disparities by 2030. [[4]](#_[4]_SEforALL_and)

Focusing on the African continent in pursuit of the ambitious goal of achieving universal access to modern energy services across Africa by 2030, it becomes imperative to explore diverse pathways within the electricity sector. Such exploration not only aids policy-makers and investors in making informed decisions but also plays a pivotal role in shaping the design of power systems. [[7]](#_[7]_M._Bazilian,)

Holistic energy systems planning endeavors to ensure that energy-related policy and investment choices encompass all viable options on both the supply and demand sides, aligning with broader national objectives such as sustainable development. However, a fundamental prerequisite is the establishment of robust national energy planning capability.

Energy planning capacity serves as a cornerstone, enhancing a country's capacity to anticipate and adapt to rapid changes while capitalizing on emerging opportunities and addressing new challenges. This asset appreciates over time as experts accumulate practical experience, enrich the local knowledge repository, and foster collaborations with stakeholders across various sectors. Historically, inadequate national planning capacity has resulted in suboptimal policy and investment decisions, contributing to unequal access to modern energy services.

Furthermore, energy planning transcends national boundaries, particularly for smaller nations with limited energy resource potentials, such as hydropower. Collaborative ventures involving infrastructure-sharing with neighboring countries offer the potential for economies of scale, highlighting the interconnected nature of energy planning across geopolitical borders.

Over the past two decades, numerous developing nations have embraced extensive policies advocating for liberalization and privatization, often under the influence of major international funders and development organizations. While these policies have occasionally bolstered the operational efficiency of individual national utilities, their impact on expanding energy access has been modest at best. This is primarily due to the fact that catering to the electricity needs of the most marginalized populations isn't financially lucrative for utilities.

This discourse mirrors the ongoing dialogue within OECD countries over the same period, where the outcomes have been similarly varied. The purported advantages of liberalizing these predominantly fragile markets remain ambiguous. In instances where liberalization has been ideologically imposed on these nations, it often proves detrimental, despite originating from well-meaning intentions.

Similar to many sectors of public policy, energy policy formulation heavily relies on analytical models. However, these models exhibit significant variations in outputs, temporal and spatial scopes, sophistication levels, terminology, underlying assumptions, system boundaries, and theoretical frameworks. Consequently, the findings generated from these analyses necessitate substantial filtration and translation to effectively inform the design and implementation of governmental policies.

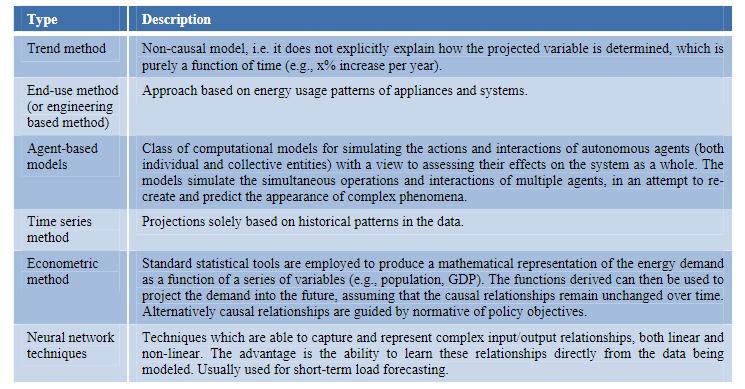
In line with this perspective a noticeable disparity between the inquiries posed by policymakers and the outcomes derives from modeling exercises. Within the realm of energy policy, power system analyses represent a subset of broader energy system modeling endeavors. Integrated resource planning models (IRP) commonly serve as pivotal tools within the power sector for strategic decision-making processes.

Power system analyses, management, and planning encompass various timeframes, spanning from sub-second activities like load balancing to multi-decade projections for capacity expansion. Fundamental to this planning is a set of electricity demand projections, forming the basis for capacity expansion strategies. Such planning often centers on least-cost optimization methodologies, considering a spectrum of constraints such as existing infrastructure conditions, financial accessibility, environmental policies, and energy security imperatives.

Across governmental planning agencies and utilities globally, an array of modern mathematical techniques is commonly employed. These range from fuzzy logic and evolutionary programming to mixed-integer linear programming and multi-objective optimization. Recent research in this domain reveals a discernible trend towards incorporating uncertainties and adapting to liberalized market dynamics.

However, for many power systems in sub-Saharan Africa, excessively sophisticated methodologies may not be imperative initially for initiating generation and infrastructure planning processes.

Energy demand projections constitute a pivotal element in the majority of planning initiatives. Various tools and methodologies of differing degrees of complexity, as outlined in Table 1, are employed to forecast future demand.



**Table 1:** Selected methods for energy demand forecasting (adapted from: McDowall & Eames (2006) and Thomas (2006)) [[7]](#_[7]_M._Bazilian,)

Each approach to energy demand projection possesses distinct strengths and weaknesses. The selection of the appropriate method hinges on several factors, notably the nature and availability of underlying data, as well as the purpose of the analysis and the timeframe involved.

In many long-term planning endeavors conducted in sub-Saharan Africa (SSA), demand projections often rely on econometric relationships tied to income (GDP) and population growth projections, coupled with elasticity relationships. Furthermore, certain methodologies incorporate explicit terms for household connections and large point demands. For instance, consider Equation 1 as depicted in PIDA (2011):

(1)

Where:

* is the unconstrained demand
* is the GDP elasticity of electricity demand
* is the average annual consumption of electricity of one household
* is the number of new connections in a year
* is the additional demand from new large demand points

In contexts where a significant portion of the population lacks access to electricity services, traditional techniques reliant on aggregates like GDP and exogenous inputs such as future annual grid connections of households may not be optimally suited. In such scenarios, alternative approaches, such as solving for a future goal and back-casting, rather than forecasting based solely on historical trends, become necessary. Ensuring that the analytical approach aligns with the specific policy and investment inquiries at hand is paramount. It has been contended that in severely supply-constrained electricity systems, demand projections hold less significance compared to capacity expansion planning and associated financing. Put differently, in typical developing country settings, additional supply tends to stimulate its own demand.

### 2.1.2 Historical Energy Trends

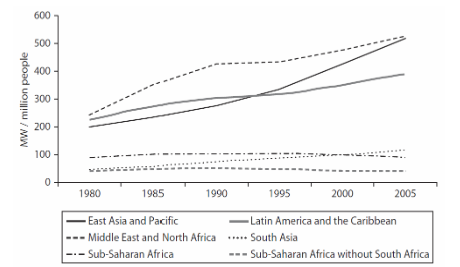
Sub-Saharan Africa grapples profoundly with a dire lack of access to electricity and subpar quality of supply, characterized by issues of cost and reliability where infrastructure exists. An estimated 580 million individuals across the continent lack access to electricity, with the majority residing in rural areas (IEA, UNDP, and UNIDO, 2010). The electrification rate in SSA stands at approximately 30%, with urban areas showing higher rates at 60% compared to rural areas at 14% (IEA, UNDP, and UNIDO, 2010).

Numerous sources offer comprehensive analyses of the energy landscape in Africa, such as Eberhard et al. (2011) [[8].](#_[8]_Anton_Eberhard,) Recent academic literature on Africa's power systems prominently features discussions concerning solar power in North Africa. Additionally, much of the literature pertaining to the power sector in SSA understandably focuses on the Republic of South Africa (RSA). Nonetheless, there exists a dedicated cohort of researchers who focus on SSA as a whole or on specific countries within the region. Despite this, the literature on power sector scenarios in sub-Saharan Africa remains relatively sparse.

The total average per capita consumption in SSA (excluding RSA) is around 155 kWh (based on EIA data). These figures are minute compared to Sth. Africa where this value is approximately 4770 kWh per capita or other OECD countries.

The installed capacity in Africa will need to grow by more then 10% just to meet Africa’s suppressed demand, keep pace with projected economic growth and provide additional capacity to support efforts to expand electrification. Most new capacity would be used to meet non-residential demands from the commercial and industrial sectors. [[7]](#_[7]_M._Bazilian,)

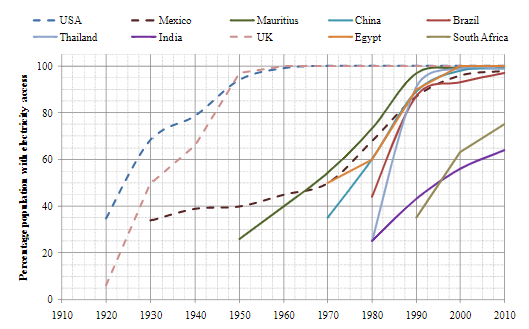
Figure 2 shows the total electricity generation capacity installed per million persons (MW/mln) in several regions. It is argued that is a relatively rough metric as it does not take into account a number of different and crucial parameters, including: T&D Transmission and Distribution losses, load patterns, locational constraints, intermittency, temporal reserve, availability, operating efficiency, and outage rates. Compared to the other world regions, the ratio of electricity generation capacity per million inhabitants is low in Africa, particularly in sub-Saharan Africa. The figure for SSA (excluding RSA) was roughly 129 MW/mln in 2008 only considering people with electricity access; if the entire population is included, the total is about 40 MW/mln.



**Fig.2:** MWs installed per one million by region [[8]](#_[8]_Anton_Eberhard,)

History presents compelling evidence that significant increases in the percentage of households with access to electricity can be achieved over relatively short periods. For instance, electrification rates surged notably in several countries, including the USA and UK during the early 20th century, and more recently in China, Brazil, and Thailand (refer to Figure 3).

As an illustrative case, Thailand witnessed a remarkable transformation, with the percentage of the population with access to electricity escalating from approximately 25% to nearly 100% within a decade. However, for most nations, this transition typically spans at least three decades, if not longer. Across these countries, prioritizing electrification, particularly in rural areas, stemmed from high national priorities driven by economic development or equity objectives.



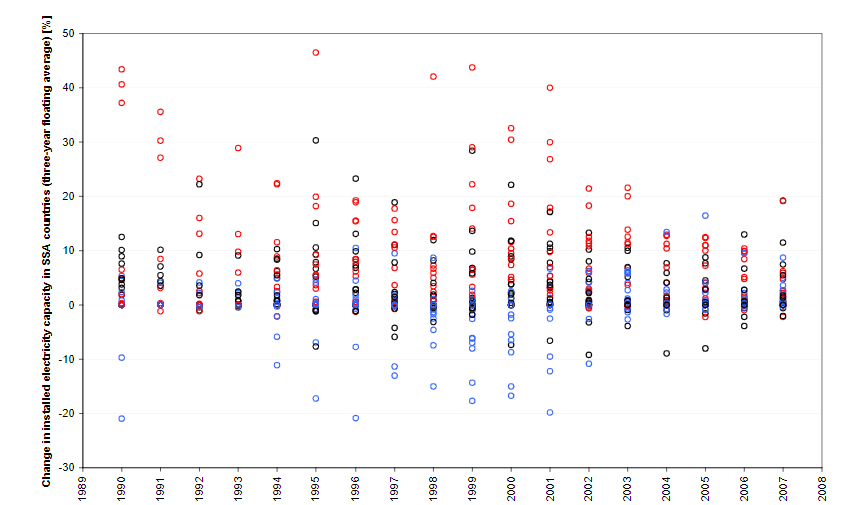
**Fig. 3:** Evolution of household electrification over time in selected countries [[7]](#_[7]_M._Bazilian,)

While several countries in sub-Saharan Africa (SSA) have experienced remarkable growth, roughly quadrupling their installed capacity over the past two decades, these advancements mostly originated from a relatively modest initial installed capacity. However, the majority of countries in the region have witnessed sluggish growth or even a decline in installed capacity.

On average, installed electricity capacity in SSA (excluding RSA) has expanded relatively steadily at a rate of around 1.7% per annum. Examining the historical growth (or contraction) rates in African countries (refer to Figure 4) yields valuable insights for several reasons. First, it elucidates that there is no discernible pattern indicating an overall increase in growth rates over time. Despite the growing recognition of the pivotal importance of energy, particularly electricity, efforts to augment generating capacity have not shown a consistent upward trajectory in recent years.

Nevertheless, there are early indications suggesting a potential acceleration in the expansion of Africa's generation capacity. Data on donor commitments to power projects suggest that, over the last five years, an average annual commitment of 3 GW of generation projects has been made. Additionally, the Annual Report of the Infrastructure Consortium for Africa 2010 highlights a significant increase in member commitments to energy projects in sub-Saharan Africa, rising from USD 1.2 billion in 2006 to USD 8.0 billion in 2010.

Secondly, while the growth rate exhibits a wide range of values, it typically falls between 0% and 10%, with the bulk of countries experiencing growth rates between 0% and 5%. Thirdly, the variability of the change in installed capacity is high, although it has been decreasing over time, especially in recent years. Finally, the graphical representation indicates that countries with larger systems (depicted as red dots in the figure), characterized by greater existing capacity and transmission and distribution grids, tend to expand their capacity more rapidly than countries with medium and small electricity systems. In fact, with a few exceptions, countries with smaller electricity systems (represented by blue dots in the graph) exhibit relatively low growth rates or even negative growth, particularly towards the end of the 1990s.



**Fig. 4:** Rate of increase (or decrease) in installed electricity capacity (with three year floating average) in SSA countries arranged by tertile (red, black and blue dots features countries with relatively large, medium, and small generating capacity, respectively, in 2008). Data: authors’ compilation from EIA

Of course, SSA countries and regions are well aware of the problems of energy access, both in terms of quantity and quality, and have developed national targets and regional plans. UNDP and WHO (2009) calculated that 68 developing countries have electricity targets.

### Prospects for Africa

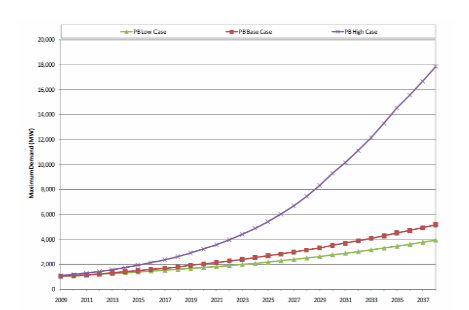
In this section is briefly considered some of the datasets and projections for the power sector in Africa. For an initial sense of scale, using EIA data, Africa has a current installed generating capacity of about 122 GW, SSA (excluding RSA) had 31 GW. This compares roughly to 28 GW in Argentina.

Africa is included in the major energy outlooks from the International energy Agency (IEA), the US dept of Energy’s Energy Information Agency (EIA), British Petroleum (BP) and other international committee. Each dataset has different levels of descriptive information coverage and aggregation. We primarily relied on the EIA dataset as it was the most transparent and complete in terms of accessible country time-series data. It is useful to look at results of these high level global exercises to get a sense of the numbers being fed into the *Global Energy Dialogue*.

Most of the African sub-regions have carried out forecasting exercises for peak energy demand, commonly both in terms of peak demand (or generation capacity) and consumption (or generation). Those projections are normally based on studies conducted at the national level. Despite forecasting methods that vary considerably, the regional plans and related documents entail a wealth of quantitative information that is all too often underutilized in further analysis and planning.

The New Partnership for Africa's Development (NEPAD), the Southern African Development Community (SADC), the Forum of Energy Ministers in Africa (FEMA), the Economic Community of West African States (ECOWAS), the East African Community (EAC) and the Central African Economic and Monetary Community Commission (CEMAC), among others, have produced strategies for electrification and increasing access to modern fuels.

A closer look at some of the regional forecasts in the interests of comparison is useful. A SAPP electricity demand forecast to 2025 shows a projected annual growth of about 2% (SAPP, 2010); the annual growth rates are projected to be higher outside RSA. Nexant shows projected WAPP average growth of 7.6% (ranging from 5-12.6%). The EAC/EAPP Demand Forecasts show very large ranges in forecasted annual growth. They provide very detailed analysis of each country’s national forecasts and the extend them to 2038 where appropriate. Interestingly, the forecasts for many of the countries show the same kind of exponential growth shown in next figure and reflect more typical trend or regression-based forecasts for “low and base” cases. Figure 5 shows the forecast to 2038 (in MW) for peak demand in Kenya, including showing sharp growth in the “High Case” from 1 GW to over 18 GW to 2038.

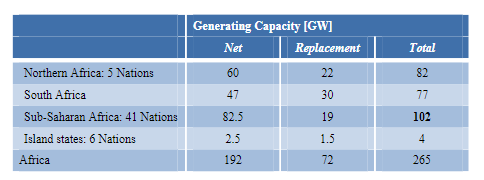


**Fig.5:** Peak demand forecasts for Kenya [[7]](#_[7]_M._Bazilian,)

In [[8]](#_[8]_Anton_Eberhard,) are shown several scenarios for Africa. They considered three type of demand: market, suppressed and social to help create three scenarios (constant access, regional target and national targets). The overall average annual electricity demand growth rate was estimated at 5.8%.

The objective of the context is to establish an infrastructure development programme articulated around priorities and phases and, prepare an implementation strategy and process including, in particular a priority action plan. The peak demand projections from initial Programme for Infrastructure Development in Africa (PIDA) shows an average 6.7% growth (with regional annual growth rates ranging from about 6-9%) over the period 2009-2040. The initial results assume that the access rate will increase from 42% in 2009 to 65% in 2030; these rates are projected to be similar in 2040.

The African Development Bank undertook a universal access scenario assessment through 2030. In Table 2 is shown the results of the capacity additions estimated. Without South Africa the total equals 102 GW, so approximately an average of 6% annual growth.



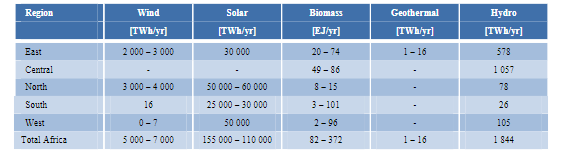
**Table 2:** Universal Energy Access scenario to 2030 (African Development Bank)

### Generation Technology

Now we investigate the various projections in terms of technology and energy resources. A special attention is given to renewable energy potentials, following the sustainable energy goal propose by the United Nations, in order to give a sense of scale to the possibilities.

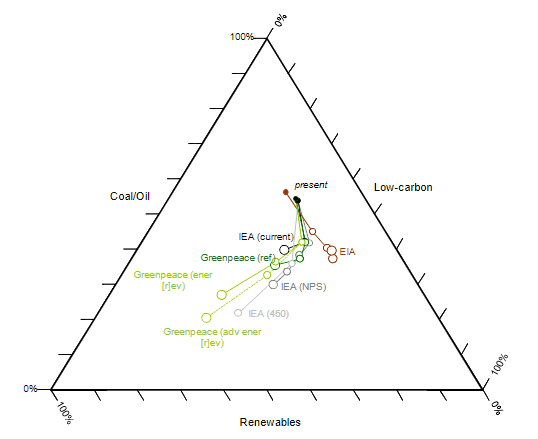
In [[8]](#_[8]_Anton_Eberhard,) is reported that over 900 TWh (approximately 220 GW installed capacity) of economically viable hydropower potential in Africa remains unexploited, located primarly in the Democratic Republic of Congo, Ethiopia, Cameroon, Angola, Madagascar, Gabon, Mozambique and Nigeria. Similarly, the Intergovernmental Panel on Climate Change (IPCC) estimates the technical hydropower potential at 1174 TWh (or 283 GW of installed capacity), only eight percent of which has been developed. Interestingly,this unused potential is about ten times the current installed generating capacity in SSA if RSA is excluded.

The International Renewable Energy Agency (IRENA) is now designing future renewable energy scenarios. The focus of their work will be on providing detailed, regional specific technology information with a clear focus on renewable energy. The following Table shows that the technical potential for renewables is enormous, and largely untapped in Africa. The accounting of biomass remains contentious; still, even using conservative assumptions, the potentials are significant.



**Table 3:** Technical potential for renewable energy in Africa by region (IRENA)

In Figure 6 is used a ternary graph to plot selected (international organization) projections in terms of electricity production in Africa by types of energy sources, namely coal and oil, renewables, and low-carbon (nuclear and gas). Such representation allows visualizing the foreseen transition in the electricity generation and corresponding technological and resources shift. The portfolio of generation types critically impacts power system design and operation (including the amount of total installed capacity required because of issues such as intermittency, ramping rates, and inertial response). All of the projections foresee a decrease, in relative terms, of carbon intensive resources in Africa in the coming two decades, including those scenarios without an explicit focus on climate change mitigation. Also, most projections feature an increase in low-carbon technologies in a first phase, before the share of renewable picks up significantly.

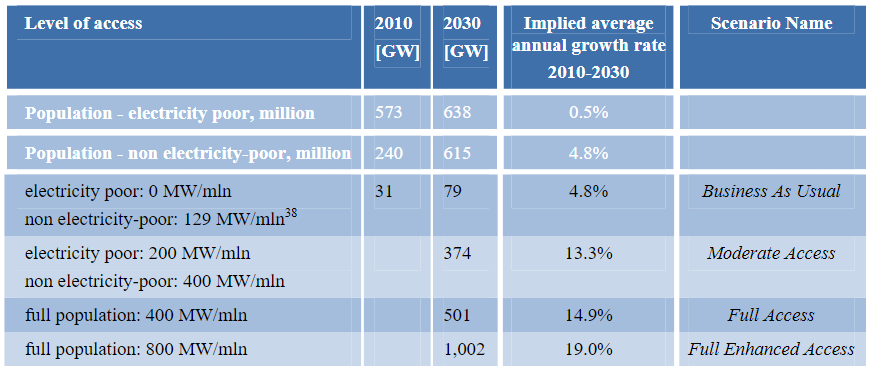


**Fig.6:** Projections of electricity generation in Africa by types of by different organisations, 2010-2030. Note: the size of the dots is proportional to the total electricity generation projected; with present estimates (filled dots), estimates in 2030 (last dot of each scenario), and intermediary estimates. Data: own compilation from IEA WEO 2010, EIA IEO 2010, and Greenpeace 2010

### Scenarios to 2030

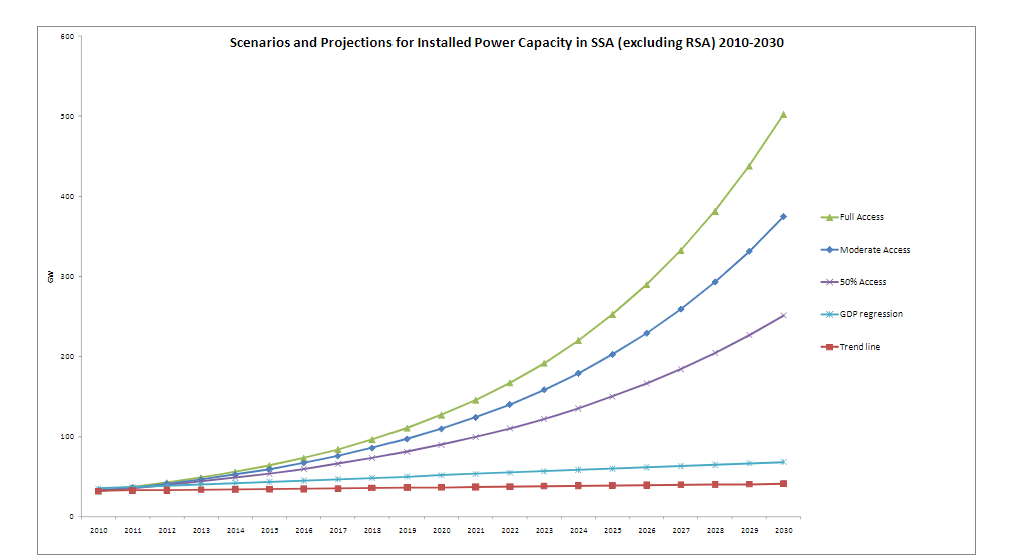
Using simple heuristics, it has been calculated “back of the envelope” electricity generation capacity requires in SSA (excluding RSA) to 2030 under various electricity access level assumptions (see table 4). It is important to note that these scenarios are not limited to household demand, but for the entire economy. In the first two scenarios it is separated the number of people without access (electricity poor) from those with access (non-electricity poor), and each category arrives at a different level of access in 2030. In the two other scenarios the entire 2030 population is brought to a single average level of access. Of course, such results are highly stylized and would, in themselves, not properly consider issue such as: intermittency, system operation, ramping etc..

The results of this evaluation are astonishing in term of the required growth rates and installed capacity. As an example, just to reach the Moderate Access case where the population has between 200-400 MW/mln requires a total of around 374 GW of installed capacity- about twelve times current levels. This implies around a 13% annual growth rate for the next 20 years as compared to 1.7% for the past 20 years. The other scenarios show that bringing access to the projected SSA (excluding RSA) population in 2030 would take approximately 500 GW to reach an average of 400 MW/mln (Full Access) and to reach 800 MW/mln (Full Enhanced Access) would double this requirement. The result assumes much higher level of access than much of the literature that focuses solely on “basic needs” at the household level.



**Table 4:** Estimates for installed electricity generation capacity required (in GW) in SSA (excluding RSA) under various access level (MW/mln) assumptions.

The next figure provides a simplified overview of several scenarios as well as projections. In addition to plotting the *Moderating Access* and *Full Access* scenarios from Table 4, it includes: a *50% Access* scenario that assumes that 50% of the population will have access at a rate of 400 MW/mln, along with two statistically derived projections based on historical data. *GPD regression* represents a regression analysis using GDP as the independent variable (with double exponential smoothing of historic data) and results in about 70 GW in 2030. The *Trendline* is a historically-based extrapolation, and projects about 43 GW in 2030.



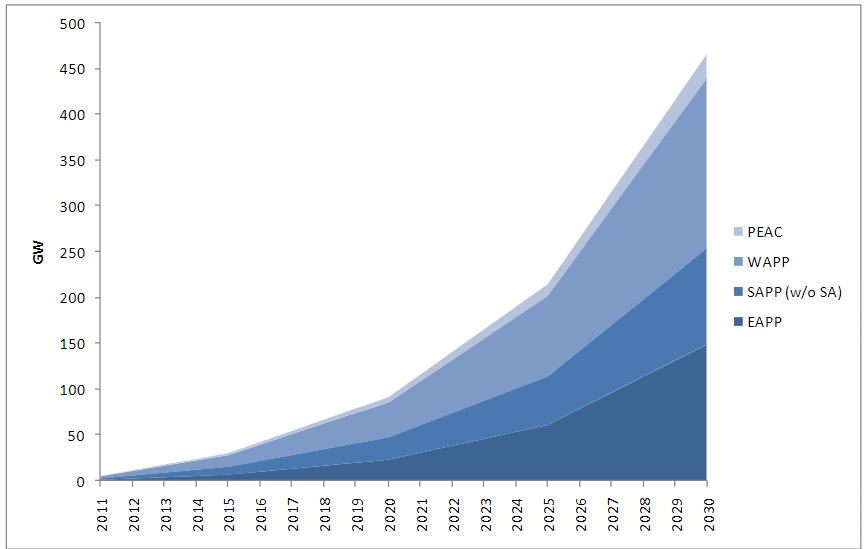
**Fig. 7:** Scenarios and projections of installed capacity to 2030 for SSA (excluding RSA)

It is also useful to consider how to “jump-start” from historic trends to, as an example, the *Low Access* case. A few well-designed large projects allow very high initial growth levels to help give confidence to the sector for an extended period of growth. For instance, the proposed Grand Inga hydroelectric project (in the Democratic Republic of Congo) could reach almost 40 GW in scale. Inga then would, theoretically, provide a significant short-term contribution to the additional capacity required. Likewise, some Nigerian projection show very high levels of short-term growth in generating plants. A few such large-scale projects might also provide the necessary impetus for transmission projects. High levels of growth in smaller or distributed generation projects would also likely support the necessary momentum.

Finally, while it is variable to illustrate what it would mean to meet a target of 100% electrification by 2030, it is also important to acknowledge that this target seems ambitious. As noted above, 30-40 years is likely a more realistic range based on the historical evidence presented, particularly given the following considerations:

* The final segment from 90%-100% access is necessarily slower due to increasing marginal costs and technical difficulties
* In addition for Africa to meet the universal electrification target 47 countries would need to do simultaneously.

Building on *Full Access* scenario, it has been briefly examined the goal “spread” evenly across the sub-regional power pool level (the Eastern Africa Power Pool (EAPP), Southern Africa Power Pool (SAPP), Western Africa Power Pool (WAPP), and the Central African Power Pool (CAPP)).



**Fig. 8:** Additional capacity needed to reach 400 MW/mln by region

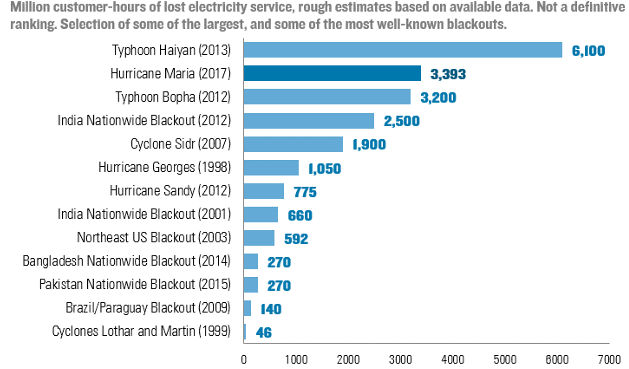
Initial results show that the WAPP has the largest total capacity in additions at 186 GW, the EAPP has 149 GW, the SAPP (excluding RSA) has 105 GW, and the CAPP has 27 GW. On an average annual basis then, SSA (excluding RSA) must add about 23 GW per year in additional capacity (EAPP: 7.4 GW, SAPP (excluding RSA): 5.2 GW, WAPP: 9.3 GW and CAPP: 1.4 GW) – equivalent to a little more than a Three Gorges Dam (22.5 GW) sized project each and every year through 2030.

## Minigrids Design Overview

Our modern society is highly dependent on the electrical grid and major outages have severe consequences. A reliable source of power is especially important for campuses (including college campuses, business parks, etc.), military bases, and other areas with critical municipal functions (such as hospitals, police, and fire stations), where public safety may be compromised by a lack of electrical power. Although backup generation is common at critical facilities, failure of backup generation resources is quite common due to lack of maintenance or insufficient fuel supplies. Advanced microgrids can be an effective solution for power delivery to critical infrastructure.

We consider a “microgrid” as an integrated energy system consisting of loads and generation operating as a coherent unit. Microgrids may operate either in parallel with, or islanded form the main electric grid, and may switch between these two states. A simple microgrid might involve minimal design effort and employ a simple design, such as only a critical load paired with a backup generator. Simple designs are typically inefficient solutions when considering all critical loads and possible threats to a given system. An “advanced microgrid” is one that is designed using Sandia National Laboratories’ Energy Surety Design Methodology (ESDM), which is a systematic process to maintain or enhance the attributes of: safety, security, reliability, sustainability, cost effectiveness, and resilience. Key components of advanced microgrid design include identifying and prioritizing critical assets, defining design basis threats, and establishing performance goals. [9]

Maintaining local power delivery during extended main electric grid outages has become increasingly important as more customers and services rely on electric power. This is highlighted in Figure 9, which shows that several of the worst blackouts in the world in terms of customer hours lost have occurred in the last 20 years.



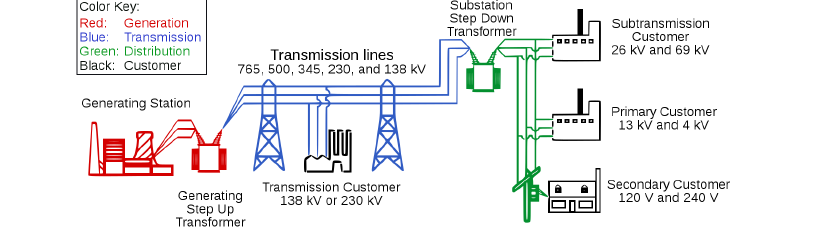
**Fig. 9:** Million customer-hours of lost electricity service, rough estimates based on available data. Selection of some of the largest and well-known blackouts. Source: DOE, National Academies, news reports, government statistics, academic, literature and Rhodium estimates

Due to interdependencies, extended power outages have cascading impacts on productivity, safety, and public health. Loss of power to a water treatment plant for an extended period will deplete reserves, impacting not only public health, but also firefighting and water for industrial uses. Outages to communications infrastructure due to lost power impacts the ability to dispatch emergency services, to coordinate mitigation efforts such as clearing debris, and to communicate with customers. Traffic signal outages and an inability to pump fuel due to power outages can cripple transportation.

These issues highlight how important it is for communities to consider options such as advanced microgrids to improve the design, operation, and management of their energy system infrastructure to minimize the impacts of extended electric grid outages. The need is for energy surety: energy systems that are safe, secure, reliable, and designed in a way that provides energy system operational assurance during routine and extended impact events caused by accidents, natural disasters, or intentional attacks. [5]

### 2.2.1 Main Electric Grid

Most electric customers are served by a main electric grid. Main electric grids may span entire continents or may cover only a small island. These electric grids typically consist of the four components shown in Figure 10: generation, transmission, distribution, and customers, although smaller systems may not have significant transmission components.



**Fig. 10:** Basic components of an electric grid (Image from FERC report: <https://www.ferc.gov/industries/electric/indus-act/reliability/blackout/ch1-3.pdf>.)

Common types of generation include coal (~27% of worldwide generation); natural gas (~27%); nuclear (~18%); hydroelectric (~13%); wind, solar, and geothermal (~10%); biofuel (~3%); and oil (~2%) power plants (IEA 2017 provisional electricity production by source: <https://www.iea.org/statistics/electricity/> ). Electric grids have typically been operated with large generating stations, with power generally flowing from generating station to customer load, as illustrated in Figure 10. However, the growth of renewable energy such as wind and solar is increasingly spreading out the generation. Utility-scale wind and solar plants may be connected to transmission lines at myriad locations across the electric grid, and residential and commercial solar often exist on the distribution system, with residential systems often behind the customer meter. Generation may be owned by an electric utility or may be owned by a private entity that contracts with the utility, such as through a power purchase agreement.

Transmission systems are networks of transmission lines designed to transport energy over long distances with minimal power losses. They are often complex mesh networks with multiple redundant paths which can be utilized in the event of a single node failure. Transmission lines are typically administered by a regional transmission organization or an intendent system operator. Careful attention is paid to balancing load and generation, maintaining a set frequency, and balancing the voltage between the three different phases.

Distribution systems complete the delivery of power to customers. The backbone of distributions systems is a high voltage “primary” system which, similar to transmission but at a lower voltage, transports the power closer to the customer. At or near the customers, distribution transformers reduce the voltage to customer-appropriate levels (such as 240V/120V). This lower voltage system is called the distribution “secondary” system and connects the low-voltage side of the distribution transformer to the customer meter. Electric utilities manage distribution systems, ensuring that power is delivered to customers at safe voltage levels.

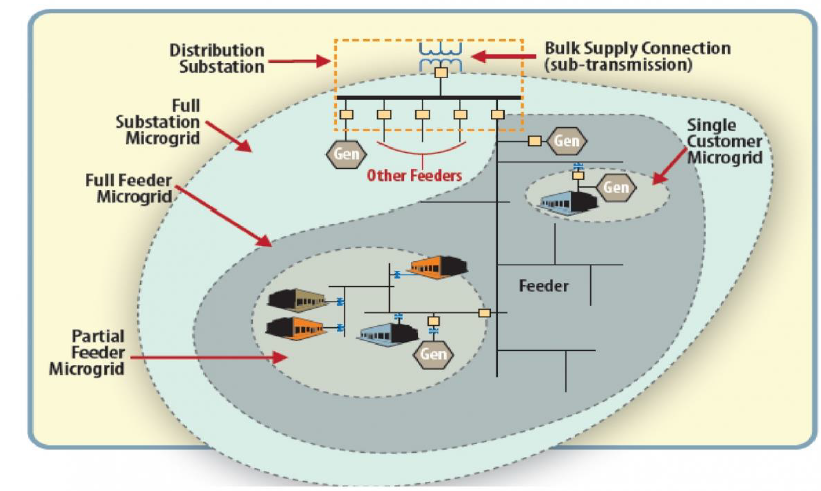
Customers can range from large industrial complexes to single-family homes. Customer voltages will vary depending on the size of the load and types of equipment used by the customer. Distribution system equipment including transformers and wires leading to the customer must be sized appropriately for the loads. A special case of customer is one that has generation behind the meter, such as a rooftop photovoltaic system. These customers will draw less load from the main electric grid when they are self-generating.

Many facets of modern society are heavily reliant on the main electric grid, and a major outage for an extended duration can have severe consequences. Several other categories of infrastructure, including water, transportation, and communications are heavily dependent on electric power infrastructure. Services including healthcare, emergency operations, command and control centers, municipal services, wastewater treatment plants, data centers, banking, and more can be affected by a loss of electric power. [5]

Many critical facilities have individual building-tied backup generators and uninterruptible power supplies (UPS) to maintain critical loads for a short duration blackout of the main electric grid. However, these resources often have not been designed or maintained to support longer-term outages from expanding types and levels of threats and disruptions. Natural disasters such as hurricanes, floods, and tornadoes, as well as intentional attacks such as cyber or physical attacks to grid infrastructure can cause outages lasting for weeks or more. Stored fuel for generators typically lasts only a few days without external refueling from central storage sites; sites which may also be affected by the event causing the extended electric grid outage. Because of the interdependency of critical services, a loss of power in one location can adversely affect other functions or operations at other locations, potentially leading to a chain of events that could have a devastating impact on overall critical services.

### 2.2.2 Functional Categories of Minigrids

A simple definition of a minigrid is a set of loads with local generation that can be isolated from the main electric grid. As seen in Figure 11, minigrids can be single customer solutions, may serve several customers as a partial feeder minigrid, or may encompass a full feeder or substation.



**Fig. 11:** Illustration depicting the various possible sizes of minigrids (Image from: <https://www.energy.gov/oe/activities/technology-development/grid-modernization-and-smart-grid/role-microgrids-helping>)

The basic operation of a minigrid can be separated into three main types based on (a) whether the minigrid is typically connected to the main electric grid or typically islanded and (b) if the minigrid has enough generation for sustained operation or simply short-term backup generation.

We separate minigrids into three basic types:

* Type 1: Minigrid for Backup Only
  + Operates only when the main electric grid is down
  + Generation is sized to cover critical loads only
* Type 2: Always Islanded Minigrid
  + Never connected to the main electric grid (e.g., a remote system far from the main grid)
  + Has enough local generation to cover all local load
* Type 3: Hybrid Minigrid
  + Operates grid-connected part of the time and islanded part of the time
    - Operation mode determined by factors including costs, main grid outages, fuel supplies, etc.
  + Has enough local generation to cover all local critical loads, may have enough generation to cover all local loads

Type 1 minigrids provide backup power to critical buildings when utility power is lost by opening the point of common coupling (PCC) main breaker switch, isolating the system form the main grid. After isolation, there is startup and synchronization of generators to the critical loads served. While the simplest Type 1 minigrid would be one generator and one critical load, the most effective Type 1 minigrids involve multiple generators and multiple critical loads, because additional generators provide redundancy and coordinated controls will make the generators run more efficiently, resulting in efficient, reliable, and resilient backup power.

Type 2 minigrids involve simply local generation and load and are never connected to the main grid. These systems may be referred to as “off-grid.” In Type 2 minigrids, it is essential to appropriately match generation and load for continuous operation. Type 2 minigrids will require larger generation resources, fuel supplies, and energy storage systems than Type 1 or Type 3, since they must constantly operate autonomously. Although there is no switch needed for isolation from the main electric grid, Type 2 may have isolation switches to separate critical loads from non-critical loads during periods of low generation (e.g., due to a fuel shortage or a lack of wind or solar resource).

Type 3 minigrids are the most flexible option. These minigrids can operate either grid-tied or islanded from the main electric grid. Type 3 minigrids will at least have generation to cover their critical loads, and often will have generation to cover all loads. The later scenario of generation to cover all loads provides significant flexibility to respond to grid signals such as time of use pricing, demand response requests, or grid outages while maintaining reliable power for all loads on the minigrid. During times of high minigrid load, the minigrid may draw power from the main electric grid to supplement its local generation. During times of low minigrid load, it may be possible to sell power back to the main grid. Sending power back to the main grid may be particularly valuable during periods of main grid peak load and during resilience events which stress the main grid.

Generation resources on minigrids are distributed energy resources (DERs). DERs can include diesel and gas engines, microturbines, fuel cells, PV, wind, biomass, and energy storage. These local generation resources enhance reliability by providing power to the minigrid’s critical resources when the minigrid is islanded. When not islanded, excess generation may be able to be sold back to the utility to offset DER capital and operation costs. DERs can also be used as peak shaving devices, operating only when the minigrid loads are large and it is desired to reduce net consumption from the utility (e.g., to minimize a capacity cost).

Site requirements will impact which generation resources are best and how the generators are able to run. For example, United States Environmental Protection Agency standards limit both NOX emissions for diesel engines and the number of hours that diesel engines can run, which can limit their ability to supply power to serve loads except under emergency conditions – and may make diesel-only systems most appropriate for Type 1 backup-only minigrids. Renewable energy including solar and wind power, especially when paired with energy storage, is particularly attractive for Type 2 and Type 3 minigrids, though wind and solar resources vary by location and season. In many cases, a large amount of generation needs can be supplied by the renewable resources and supplemented as needed by other generation such as diesel generators or by drawing power from the main grid for Type 3 minigrids.

## Resilience Engineering: Fundamental Concepts

## 2.4 EDA Exploratory Data Analysis

## 2.5 Anomaly Detection: Applications and Methods

# METHODOLOGY

## Description of the study context

## Design and Implementation of the Resilience Engineering Framework

## Methodologies for integrating anomaly detection into the framework

# DESIGN AND IMPLEMENTANTION OF ANOMALY DETECTION ALGORITHM

## Algorithm Selection for Anomaly Detection

## Data Collection and Preparation (Dataset?)

## Algorithm Implementation

## 4.4 Exploratory Data Analysis

## Results

# 5. EVALUATION OF MINIGRID RESILIENCE

## 5.1 Resilience Indicators

## 5.2 Resilience Analysis Before and After Implementation

## 5.3 Results and Interpretation

# 6. ANALISYS AND DISCUSSION

## 6.1 Analysis of the results obtained from the application of the integrated framework

## 6.2 Discussion of theoretical and practical implications

## 6.3 Limitations and potential improvements

# 7. CONCLUSIONS

## 7.1 Summary of main results

## 7.2 Study limitations

## 7.3 Potential Future Developments

# 8. ACKNOWKEDGMENTES

# 9. BIBLIOGRAPHY

### [1] International Energy Agency (IEA), (2010) Energy Access: How to make modern energy access universal.

### [2] Knowledge Note of CIF Climate Investment Fund, (2014), Increasing Rural Energy Access through Mini-Grids

### [3] Subhes C. Bhattacharyya (2012), *Energy access programmes and sustainable development: A critical review and analysis*, Energy for Sustainable Development Volume 16, Issue 3, September 2012, Pages 260-271

### [4] SEforALL and Climate Policy Initiative (2019), Energizing Finance: Understanding the Landscape, Research Report

### [5] Saeid Charani Shandiz, Greg Foliente, Behzad Rismanchi, Amanda Wachtel, Robert F. Jeffers (2020), *Resilience framework and metrics for energy master planning of communities*, Energy, Volume 203

### [6] Hollnagel et al., (2006), Resilience Engineering Concepts and Precepts, Ashgate Edition

### [7] M. Bazilian, P. Nussbaumer & al., (2011), Energy Access Scenarios to 2030 for the Power Sector in Sub-Saharan Africa, Fondazione Eni Enrico Mattei FEEM Working Paper No. 68.2011

### [8] Anton Eberhard, Katharine Gratwick, Elvira Morella, Pedro (2017), *Independent Power Projects in Sub-Saharan Africa: Investment trends and policy lessons,* Energy Policy, Volume 108, Pages 390-424

### [9] Sandia National Laboratories, U.S. Department of Energy (DOE) (2019). Fundamentals of Advanced Microgrid Design.