HUMBER INSTITUTE OF TECHNOLOGY AND ADVANCED LEARNING (HUMBER COLLEGE)

"Driving Sustainable Energy Transformation: Analyzing IKEA's Renewable Energy and Clean Energy Access Initiatives"

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Abstract:

As one of the world's largest and most influential furniture companies, IKEA has consistently prioritized sustainability, a vision championed by its founder, Ingvar Kamprad. This report explores IKEA’s unwavering commitment to creating a more sustainable and environmentally friendly world.

The project is titled "Driving Sustainable Energy Transformation: Analyzing IKEA's Renewable Energy and Clean Energy Access Initiatives," as it centers on the utilization of advanced data analysis techniques to provide actionable insights. By integrating the "SDG Index 2000-2023" dataset into a robust analytics framework, the team employed descriptive analytics, predictive modeling through linear regression, and K-means clustering to identify patterns, forecast sustainability scores, and segment countries based on their performance. These methodologies were instrumental in addressing key metrics such as affordable and clean energy goal and climate action goal.

Moreover, the project emphasized the seamless integration of these data-driven solutions into IKEA's existing IT architecture. Power BI dashboards were developed to visualize the findings dynamically, enabling IKEA personnel across the globe to access real-time insights and make informed, data-driven decisions. This approach not only optimized IKEA's sustainability efforts but also provided a strategic framework for monitoring progress and identifying areas for targeted interventions.

All in all, this report offers a comprehensive analysis of how IKEA is driving sustainable energy transformation through innovative data analytics. By leveraging advanced techniques and integrating them into operational processes, IKEA continues to reinforce its global sustainability efforts, setting a benchmark for corporate responsibility in the pursuit of a greener future.

Keywords:

IKEA, sustainability, renewable energy, clean energy access, Sustainable Development Goals (SDGs), affordable and clean energy (Goal 7), climate action (Goal 13), linear regression, predictive analytics, K-means clustering, data-driven decision-making, Power BI dashboards, IT architecture, environmental sustainability, and corporate social responsibility (CSR)

Acknowledgement:

We are immensely grateful for the opportunity to work collaboratively on this capstone project, which delves into a topic of significant global importance—sustainability and the environment. Coming from diverse fields and backgrounds yet sharing a common heritage from Asia and now living in Canada, this project has been particularly meaningful as it resonates deeply with our collective interest in building a sustainable future. After much discussion and deliberation, we chose to analyze the sustainability efforts of IKEA, focusing on the Sustainable Development Report 2023 dataset. This decision was driven by our shared passion for environmental stewardship and the desire to contribute to a greater good.

We extend our heartfelt thanks to our program coordinator, whose guidance and support have been instrumental in allowing us to apply the theoretical knowledge we've acquired over the past few months into this comprehensive project. This capstone project has provided us with a valuable platform to integrate our learning and bring it to life.

Our deepest gratitude goes to Professor Ameera Al-Karkhi, whose unwavering patience, dedication, and genuine interest in our success have been a constant source of inspiration. Her encouragement and insightful feedback have significantly enhanced the quality of our work. Under her mentorship, we not only honed our research skills but also learned how to effectively incorporate machine learning models into our analysis. Professor Al-Karkhi's commitment to our development, through both personal meetings and extensive email communication, has been profoundly appreciated.

Lastly, we wish to express our sincere thanks to our peers and opponents for their constructive critiques and thoughtful reviews. Their feedback has been invaluable in refining our project, helping us to continuously improve and reach the highest standards in our work.

Sincerely,
Team 5 (Hira, Qi, Ravneet, Taniya, Harshit, Devisha)

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Introductions:

"Waste of resources is a mortal sin at IKEA." – Ingvar Kamprad

The global ecosystem, characterized by its interconnected resources, faces significant strain due to current rates of economic and population growth, which may become unsustainable beyond the year 2100, even with advanced technology (Limits of Growth, Club of Rome, 1972). Since the publication of "Limits of Growth," the topic of sustainability has garnered increasing attention from scholars across various disciplines. The concept of sustainability, which has evolved considerably over time, was defined by the Brundtland Commission as "development that meets the needs of the present without compromising the ability of future generations to meet their own needs." Despite its widespread use, the term still lacks a universally consistent definition.

This work aims to provide a deeper insight into one of the key aspects of sustainability—environmental stewardship (Craig, 2008). In the context of business economics, sustainability is recognized as an implicit acknowledgment of social and economic responsibilities, explicitly incorporating principles of environmental stewardship and social equity. This approach not only holds the potential to reduce long-term costs for companies but also promotes a balanced consideration of economic stability, ecological compatibility, and social equilibrium (Craig, 2008, p. 363).

Sustainability can be integrated into various facets of a business, including strategic management and operational practices. Practical sustainability approaches, such as backcasting, can be employed at a high strategic level in corporations, with social utility becoming an inherent part of entrepreneurial ventures (Alänge, 2015). Using IKEA as a case study, this paper focuses on areas such as sustainable development investments, building stronger markets, and other critical aspects of sustainability.

This report examines IKEA's renewable energy and clean energy access initiatives, analyzing their impact on advancing the company's sustainability agenda in alignment with the United Nations Sustainable Development Goals (SDGs).

The focus of this report is to provide a comprehensive analysis of the strategies IKEA has implemented to drive sustainable energy transformation. Using data from the "SDG Index 2000-2023," the report explores the company's efforts in achieving key sustainability metrics, with particular emphasis on affordable and clean energy (SDG 7) and climate action (SDG 13). Through advanced data analysis techniques, including predictive modeling and clustering, the report identifies patterns, evaluates the effectiveness of IKEA's initiatives, and offers actionable insights for future strategies.

The analysis was conducted by a dedicated team of researchers, each contributing their expertise in various aspects of the project, from solution implementation and optimization to testing and reviewing. This collaborative effort ensures that the findings and recommendations presented in this report are robust, data-driven, and aligned with IKEA's long-term sustainability goals.

This report is intended to serve as a valuable resource for IKEA's stakeholders, providing them with the necessary tools and insights to continue leading the way in sustainable energy practices. By understanding the current landscape and identifying areas for improvement, IKEA can further enhance its contributions to global sustainability and continue to set a benchmark for other corporations worldwide.

Business Problem Overview:

As the global emphasis on sustainability intensifies, businesses face increasing pressure to adopt practices that align with the United Nations Sustainable Development Goals (SDGs). For IKEA, a global leader in the retail industry, the challenge is not only to maintain its competitive edge but also to lead by example in the pursuit of environmental responsibility. Central to this challenge is the need to effectively integrate renewable energy and ensure clean energy access across its operations worldwide.

Despite significant strides in sustainability, IKEA faces a complex business problem: How can the company enhance its renewable energy initiatives and clean energy access strategies to meet its sustainability goals while continuing to grow and thrive in a competitive global market?

The problem is multifaceted, involving the identification of optimal renewable energy sources, efficient deployment of these resources, and ensuring that these initiatives are scalable and cost-effective. Additionally, the company must navigate varying regulatory environments, supply chain complexities, and evolving consumer expectations regarding sustainability.

Scope Statement:

The scope of this report is to analyze and evaluate IKEA's current strategies for integrating renewable energy and improving clean energy access within the framework of the United Nations Sustainable Development Goals (SDGs). Specifically, the report will focus on the following areas:

- **Assessment of Renewable Energy Initiatives**: Review and assess IKEA's existing renewable energy initiatives, including the types of renewable energy sources utilized, geographic distribution of these initiatives, and their alignment with the company's sustainability objectives.
- **Analysis of Clean Energy Access**: Examine IKEA's efforts to improve clean energy access across its global operations, considering factors such as energy efficiency, cost-effectiveness, and scalability.
- **Evaluation of Performance Against SDG Targets**: Utilize data from the "SDG Index 2000-2023" to evaluate IKEA's progress towards relevant SDG targets, identifying strengths, gaps, and areas for improvement.
- **Regulatory and Market Considerations**: Analyze the impact of varying regulatory environments and market conditions on IKEA's renewable energy and clean energy access strategies, highlighting challenges and opportunities.
- **Recommendations for Strategic Improvement**: Based on the analysis, provide actionable recommendations to enhance IKEA's renewable energy initiatives and clean

energy access strategies, ensuring they are more effective, scalable, and aligned with global sustainability goals.

Analytics Questions:

1. Countries having Highest Potential for Sustainable Development Investments?
2. Areas having Strongest Markets for Economic Growth and Innovation?
3. In which countries can IKEA's investment have the most significant overall impact on advancing?

Literature Review:

This thesis by Luu, M. investigates the implementation of green warehousing practices at IKEA Finland, focusing on three key areas: energy efficiency, waste management, and future sustainability proposals. The research aims to evaluate IKEA's current warehouse sustainability and develop actionable strategies for further improvement. The study is grounded in a comprehensive review of green supply chain management literature, emphasizing advanced models in energy efficiency and waste management. A qualitative empirical approach was employed, involving a desktop study, interviews with key IKEA personnel, and analysis of sustainability reports. The findings reveal that IKEA's current practices in energy efficiency and waste management are exemplary, with innovative approaches already in place. To enhance future warehouse sustainability, the study proposes three key strategies: establishing Key Performance Indicators (KPIs) for energy and waste management, utilizing biomass energy generation methods, and redesigning warehouses for greater sustainability. These recommendations aim to support IKEA Finland in advancing its green warehousing initiatives.

Another case study “Sustainability by Design: IKEA’s Eco-Friendly Marketing Efforts” explores IKEA's comprehensive approach to sustainable marketing, highlighting how the global retail and home furnishings leader has integrated sustainability into its core business practices. By examining IKEA's foundational principles—affordability, accessibility, and sustainability—the study reveals how these elements have shaped the brand's market position and its commitment to reducing environmental impact. Key initiatives include the use of sustainable materials, energy-efficient practices, and renewable energy sources, all of which are supported by transparent communication, community involvement, and strategic partnerships. The study also showcases IKEA's innovative marketing strategies that promote recycling, repurposing, and the circular economy, effectively engaging consumers in eco-conscious living. Additionally, it emphasizes the brand's dedication to social and environmental causes, demonstrating IKEA's broader commitment to fostering sustainable living and responsible consumer behavior. Through this case study, IKEA emerges as a pioneer in sustainable marketing, setting a global example for integrating eco-friendly practices into business operations and consumer engagement.

Key Data Entities:

Data sources:

The datasets used in this report were downloaded from Kaggle. These datasets were originally published in conjunction with the 2023 Paris Summit for a New Global Financial Pact. The summit, held in 2023, emphasized the importance of scaling up development finance and reforming the global financial architecture to support the Sustainable Development Goals (SDGs). This year's edition of the summit brought together global leaders, policymakers, and experts to discuss and address the urgent need for financial reforms and increased development funding to achieve the SDGs.

Details of the Data:

Source: Kaggle
Event: Paris Summit for a New Global Financial Pact
Focus: Scaling up development finance and reforming global financial architecture for SDGs

Main Business Data Entities Relevant to the Business Problem:

To address the business problem of increasing IKEA's renewable energy share and enhancing clean energy access in developing countries, several key data entities are relevant. These entities encapsulate the essential information required for analysis and decision-making.

1. Country
Attributes:
country_code: Unique code for the country.
country_name: Name of the country.
region: Geographic region of the country.
income_group: Income classification of the country (e.g., low-income, middle-income, high-income).

2. Energy Access and Consumption
Attributes:
year: Year of the data record.
access_to_electricity: Percentage of the population with access to electricity.
access_to_clean_fuels: Percentage of the population with access to clean cooking fuels.
renewable_energy_share: Percentage of renewable energy in the total final energy consumption.
electricity_from_fossil_fuels: Amount of electricity generated from fossil fuels (TWh).
electricity_from_nuclear: Amount of electricity generated from nuclear sources (TWh).
renewable_electricity_capacity_per_capita: Capacity of renewable electricity generated per capita.

3. Financial Flows
Attributes:
financial_flows_to_developing_countries: Amount of financial flows to developing countries (in US $).

4. Sustainable Development Goals (SDG) Scores
Attributes:
overall_score: Composite score representing overall performance on SDGs.
goal_1_score: Score for No Poverty.

goal_2_score: Score for Zero Hunger.
goal_3_score: Score for Good Health and Well-being.
goal_4_score: Score for Quality Education.
goal_5_score: Score for Gender Equality.
goal_6_score: Score for Clean Water and Sanitation.
goal_7_score: Score for Affordable and Clean Energy.
goal_8_score: Score for Decent Work and Economic Growth.
goal_9_score: Score for Industry, Innovation, and Infrastructure.
goal_10_score: Score for Reduced Inequalities.
goal_11_score: Score for Sustainable Cities and Communities.
goal_12_score: Score for Responsible Consumption and Production.
goal_13_score: Score for Climate Action.
goal_14_score: Score for Life Below Water.
goal_15_score: Score for Life on Land.
goal_16_score: Score for Peace and Justice Strong Institutions.
goal_17_score: Score for Partnerships to achieve the Goal.

5. Energy Projects
Attributes:
project_id: Unique identifier for the project.
country_code: Code of the country where the project is implemented.
project_name: Name of the project.
project_type: Type of project (e.g., solar, wind, hydro).
start_date: Start date of the project.
end_date: End date of the project (if applicable).
investment_amount: Amount invested in the project (in US $).
expected_capacity: Expected energy generation capacity (MW).
actual_capacity: Actual energy generation capacity (MW).

Existing Systems of Record for Each Data Entity:

To effectively manage and analyze the business data entities relevant to the business problem, various systems of record are utilized. These systems store and maintain the data, ensuring accuracy, accessibility, and security.

1.Country:
World Bank Database
United Nations Data Repository
International Monetary Fund Database

2.Energy Access and Consumption:
International Energy Agency
World Bank Energy Data
UN Sustainable Energy for All (SEforALL)

3.Financial Flows:
OECD Development Assistance Committee (DAC)
World Bank Financial Flows Database
International Monetary Fund

4.Sustainable Development Goals (SDG) Scores:
United Nations SDG Global Database
Sustainable Development Solutions Network (SDSN)
World Bank SDG Dashboard

5.Energy Projects:
International Renewable Energy Agency (IRENA) Project Database
World Bank Project Database
National Renewable Energy Laboratories (NREL)

These systems of record ensure the availability and reliability of data needed for analyzing and addressing IKEA's business problem of increasing the share of renewable energy and enhancing clean energy access in developing countries.

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T	U
1	country	country	year	sdg_inc	goal_1	goal_2	goal_3	goal_4	goal_5	goal_6	goal_7	goal_8	goal_9	goal_10	goal_11	goal_12	goal_13	goal_14	goal_15	goal_16	goal_17
159	AFG	Afghanista	2023	49.0056	12.4105	46.91514	37.48671	34.366	32.92625	50.426	35.9325	39.535	9.724571	69.7005	24.494	96.67986	99.03433	65.41225	73.2382	44.79618	45.289
168	AFG	Afghanista	2022	49	12.4	46.9	37.5	34.4	32.9	50.4	35.9	39.5	9.7	0	24.5	96.7	99	0	73.2	44.8	45.3
334	AFG	Afghanista	2021	46.3	20	46.7	37.5	34.4	32.9	50.4	35.9	39.5	9.7	0	29.4	96.7	99	0	73.2	44.6	45.3
500	AFG	Afghanista	2020	47.3	27.9	46	37.6	42	30.2	50.4	35.9	41.1	9.8	0	30.2	96.7	99	0	73.2	45.3	44.1
666	AFG	Afghanista	2019	46.4	29.4	47	36.5	42	30.8	49.2	35.6	40.6	9.7	0	29.8	96.7	99	0	60.9	46.1	42
832	AFG	Afghanista	2018	46.3	29.1	47.8	36.9	40.2	29	47.9	35.4	40.8	9.5	0	32.8	96.7	99	0	60.9	45.6	42.1
998	AFG	Afghanista	2017	45.6	29.6	43.5	35.1	38.9	27.1	46.6	38.3	39.9	8.8	0	33.6	96.6	99.1	0	60.9	45.5	40.1
164	AFG	Afghanista	2016	44.7	29.8	44.3	34.4	37.4	24.8	45.4	36.5	38.5	8	0	36	96.5	99.2	0	56.5	45.7	38.2
330	AFG	Afghanista	2015	41.6	30.1	45	33.4	17.5	22.4	44.1	26.6	39.1	6.4	0	31.3	96.6	99.1	0	53	44.3	35.5
496	AFG	Afghanista	2014	40.8	30.7	44.3	30.9	1.6	21.8	42.9	31.6	38.7	5.8	0	33.6	96.3	99.1	0	53	45.3	36
662	AFG	Afghanista	2013	39.7	31	44.2	29.6	1.6	21.3	41.6	24.5	38.5	6.6	0	28.9	96	99	0	53	44.3	35.6
828	AFG	Afghanista	2012	39.7	30.5	44.3	30.4	1.6	21	40.4	23.9	38.5	6.5	0	31.4	96.1	98.9	0	53	43.5	35.3
994	AFG	Afghanista	2011	38.4	27.9	42	30.6	1.6	21	39.2	15.7	38.5	5.6	0	25.9	96	98.8	0	53	43	36.9
160	AFG	Afghanista	2010	38.8	28.8	43.2	31.4	1.6	21	38	15.2	38.5	5.5	0	29.9	96.3	99	0	53	43.8	36.6
326	AFG	Afghanista	2009	38.3	28.8	43	28.1	1.6	20.8	36.9	15.4	38.5	5.4	0	30.3	96.6	99.1	0	53	39.9	36.7
492	AFG	Afghanista	2008	37.3	28.8	37.8	25.9	1.6	21	35.7	14.2	38.5	5.2	0	28	96.3	99.2	0	51.8	39.2	36
658	AFG	Afghanista	2007	38	28.8	39.5	24.4	1.6	21	34.6	27.6	38.5	5.2	0	27.6	96.2	99.3	0	51.8	39.2	34.8
824	AFG	Afghanista	2006	37.6	28.8	36.5	22.7	1.6	20.8	33.9	27.5	38.5	5.2	0	27.3	95.9	99.3	0	51.8	39.2	34.7
990	AFG	Afghanista	2005	37.5	28.8	35.9	22.6	1.6	20.8	33.6	27.4	38.4	5.2	0	26.9	95.7	99.4	0	51.8	39.2	34.2
156	AFG	Afghanista	2004	37.1	28.8	32.1	21.1	1.6	20.8	33.3	28	38.5	5.2	0	26.8	94.8	99.4	0	51.8	39.2	34.2
322	AFG	Afghanista	2003	36.7	28.8	32.5	19.9	1.6	20.8	33	24.5	38.4	5.2	0	26.5	94.4	99.4	0	51.8	39.2	34.2
488	AFG	Afghanista	2002	36.3	28.8	30.7	19.7	1.6	20.8	32.7	21.5	38.4	5.2	0	26.1	94.1	99.4	0	51.8	39.2	34.2
654	AFG	Afghanista	2001	36.3	28.8	30.6	19.4	1.6	20.8	32.4	22.3	38.5	5.2	0	25.8	94.5	99.4	0	51.9	39.2	34.2
820	AFG	Afghanista	2000	36	28.8	27.3	19.2	1.6	20.8	32.4	21	38.5	5.2	0	25.8	94.7	99.4	0	51.9	39.2	34.2

Figure 1 Dataset Snapshot

Data Flow Diagram:

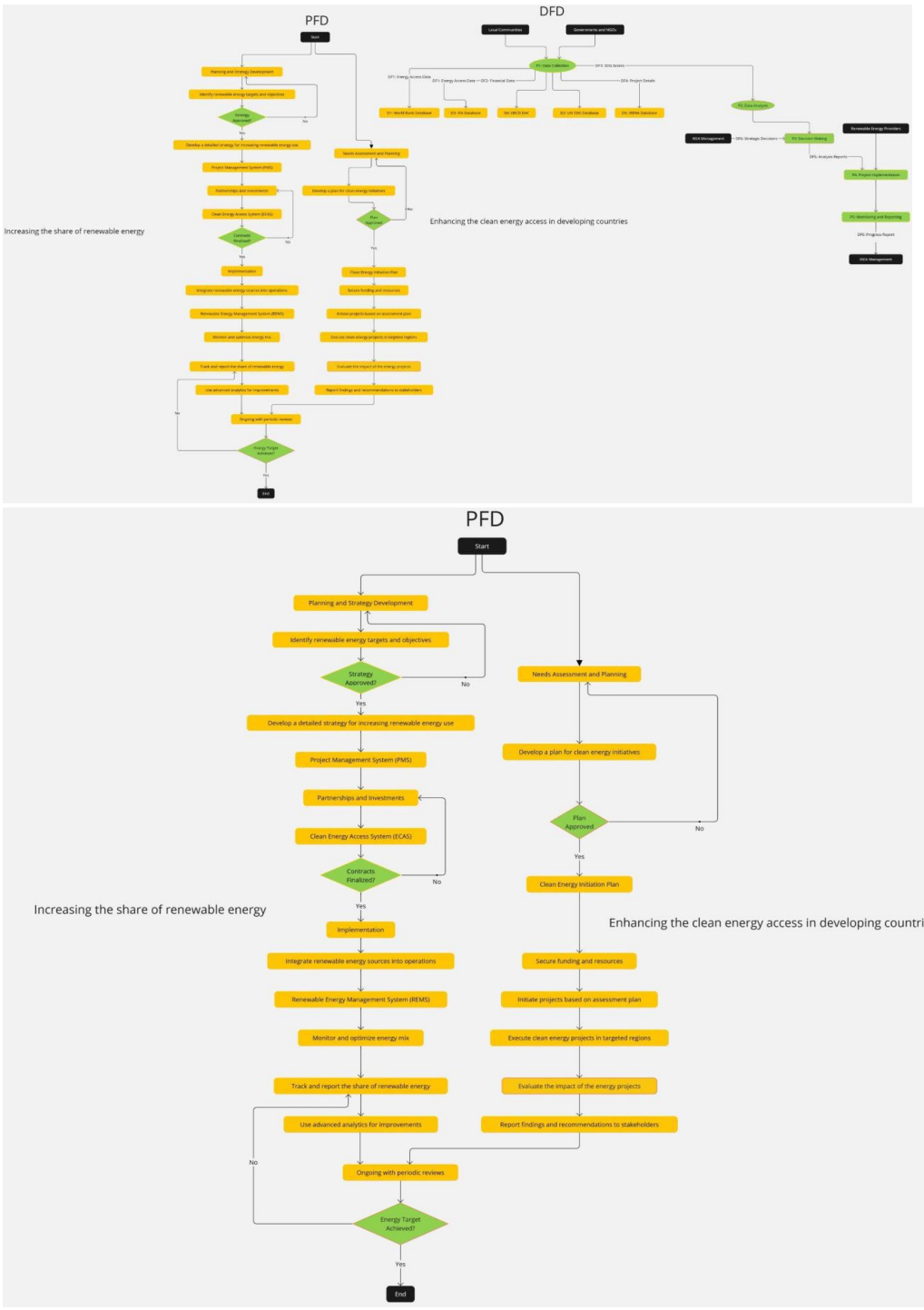

Figure 2 Data Flow Diagram

Brief overview and Methodology used to manipulate data:

In this report, various data cleaning techniques were utilized to ensure the datasets were accurate, consistent, and suitable for analysis.

The project employs a comprehensive approach, integrating predictive modeling, clustering, and data visualization to offer a detailed analysis of the current state and future trajectory of clean energy access across different countries. The insights derived from this analysis are intended to help IKEA prioritize investments and interventions in regions that need the most support to meet sustainability goals.

Methodology-

The methodology employed in this project is a multi-stage process, designed to provide a robust and detailed analysis of IKEA's sustainability efforts:

Data Cleaning:
The cleaning process focused on addressing-

a. Data duplication
b. Removing irrelevant values
c. Correcting typographical errors
d. Preserving and transforming data types
e. Standardizing data from different sources
f. Handling Missing data

The data cleaning process was essential in transforming raw data into a reliable and analysable format. By addressing data duplication, removing irrelevant values, correcting typographical errors, preserving and transforming data types, standardizing data from various sources, and handling missing data, we ensured the dataset's integrity and reliability. These steps were critical in providing a solid foundation for analysing IKEA's path to 100% renewable energy and enhancing clean energy access in developing countries.

Data Collection and Integration:
The project began with the integration of data from the "SDG Index 2000-2023" dataset, focusing on metrics that align with IKEA's renewable energy and clean energy access goals.
The data was imported into Python for preprocessing and into Power BI for visualization purposes.

Preliminary Setup and Configuration:
The development environment was set up using Python, with key libraries like Pandas, Seaborn, and Scikit-learn installed for data manipulation and analysis.
Power BI was configured for creating interactive dashboards that allow stakeholders to explore data and insights in real time.

Descriptive Analytics:
Seaborn was utilized for initial descriptive analysis to identify key patterns, distributions, and relationships within the data. This step provided a foundational understanding of the dataset and highlighted areas that required deeper investigation.

Predictive Modeling:
A Linear Regression model was developed to predict the SDG Index scores based on various input features. This model helped in understanding how changes in specific SDGs could influence overall sustainability scores.
K-Means Clustering was employed to segment countries based on their performance in SDGs related to clean energy and climate action. This allowed for the identification of country clusters that could benefit from tailored sustainability strategies.

Data Visualization and Dashboard Development:
The cleaned and transformed data was imported into Power BI to create interactive dashboards. These dashboards were equipped with features like filters, slicers, and drill-downs to enhance user interaction and exploration.
Visualizations, including bar charts and scatter plots, were used to present insights on countries' performances in SDG Goals 7 (Affordable and Clean Energy) and 13 (Climate Action).

Model Evaluation and Iteration:
The predictive models and clustering algorithms underwent several iterations to improve their accuracy and reliability. Techniques like cross-validation and hyperparameter tuning were used to refine the models.
The dashboards were also iteratively enhanced based on feedback to ensure they met the needs of stakeholders and could be easily integrated into IKEA's decision-making processes.

Integration with IKEA's IT Architecture:
The final solutions were seamlessly integrated into IKEA's existing IT infrastructure. This involved setting up secure data pipelines from IKEA's databases to the analytics platforms, ensuring continuous and reliable data flow.

Outcome Testing and Review:
Extensive testing was conducted to evaluate the models' performance, accuracy, and computational efficiency. The outputs were analyzed visually and statistically to ensure they met the desired outcomes. The results were then compared with the project's goals to confirm that the solutions provided actionable insights for IKEA's sustainability initiatives.

Solution and it's fit in the existing architecture:

Initial Steps of the Solution Implementation Process

Preliminary Setup and Configuration-

Development Environment: The project commenced with setting up a robust development environment essential for data analysis and visualization. This included the installation and configuration of Python and associated libraries like Pandas, Seaborn, Scikit-learn, and the setup of Power BI for dashboard creation.

Data Integration: We integrated data from the "SDG Index 2000-2023" dataset, focusing on various sustainability metrics relevant to IKEA's goals. This integration was pivotal for ensuring that the data was ready for analysis and could be accessed through the Power BI dashboards.

Online Dashboard Setup: Power BI dashboards were configured to be accessible online to ensure that IKEA personnel worldwide could interact with the insights derived from the data analysis in real-time, enhancing decision-making processes.

Initial Testing of Approaches/Algorithms/Models

Descriptive Analytics Using Seaborn: Utilized Seaborn for initial descriptive analysis to understand distributions and relationships within the SDG data. This step helped in identifying key patterns and anomalies that might affect further analysis.

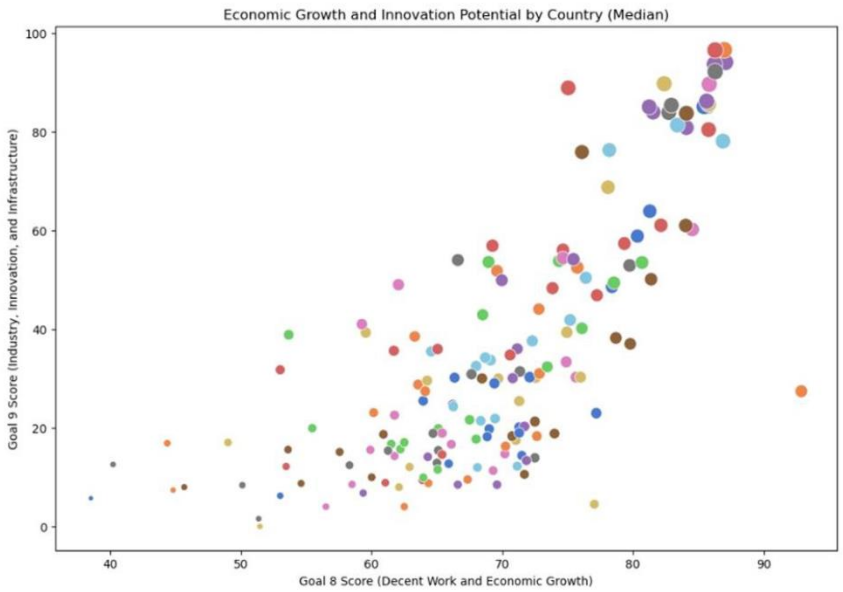

Figure 3 Strongest Markets for Economic Growth and Innovation

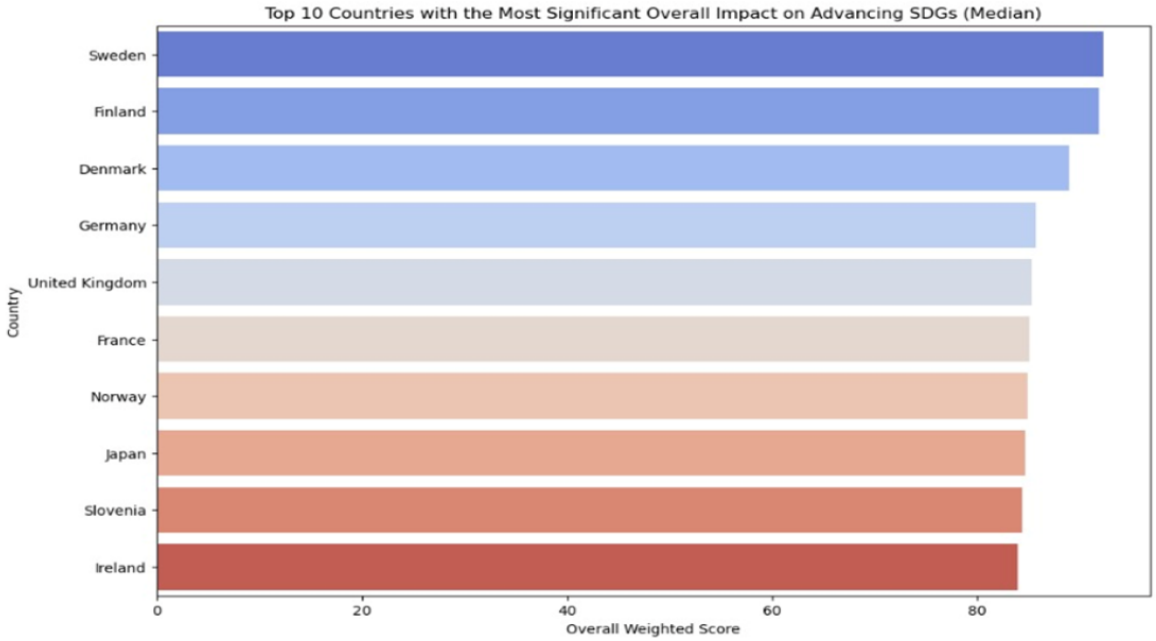

Figure 4 Top 10 Countries with the most significant overall impact on advancing SDGs(Median)

Predictive Modeling:

Linear Regression: Deployed to predict the sustainability scores based on various SDG inputs. This model was crucial for understanding how changes in one or more SDGs could impact the overall sustainability score.

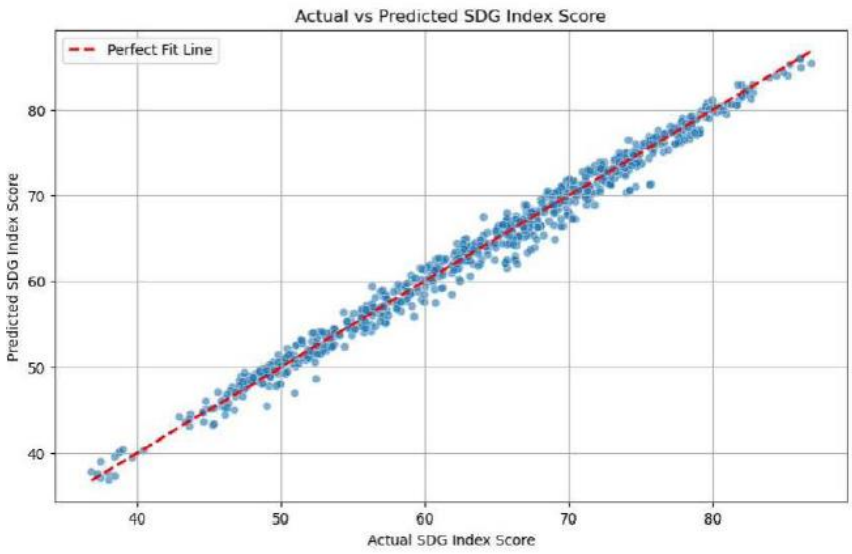

Figure 5 Actual vs Predicted SDG Index score

This shows a scatter plot comparing actual versus predicted SDG Index Scores. Here are some insights based on the plot:

Perfect Fit Line: The red dashed line represents a perfect fit line where the predicted SDG index scores exactly match the actual SDG index scores. This line has a slope of 1 and passes through the origin (y = x).

Data Points Distribution: The blue points represent the actual versus predicted SDG index scores. The points are closely clustered around the perfect fit line, indicating that the model's predictions are highly accurate.

Model Performance: The tight clustering of points around the perfect fit line suggests that the model has a high degree of accuracy and minimal error in its predictions. There are no significant deviations or outliers, indicating that the model performs well across the entire range of SDG index scores.

Insights on Predictions: The model accurately predicts the SDG index scores with only minor deviations. The predictions align well with the actual scores, showing that the model can reliably be used for forecasting SDG performance.

Strategic Implications: Given the model's accuracy, it can be effectively used for predictive analytics to guide decision-making in sustainability initiatives. IKEA can rely on these predictions to monitor progress and identify areas needing intervention.

Further Considerations: While the current model performance is excellent, continuous monitoring and validation with new data can ensure sustained accuracy.

Any future enhancements or changes in the data distribution should be tested to maintain the reliability of predictions.

Overall, the scatter plot indicates that the model's predictions of SDG index scores are very close to the actual scores, demonstrating a successful implementation of the predictive model.

K-Means Clustering: Applied to segment countries into clusters based on their sustainability performance. This model aided in identifying groups of countries that could benefit from targeted sustainability investments.

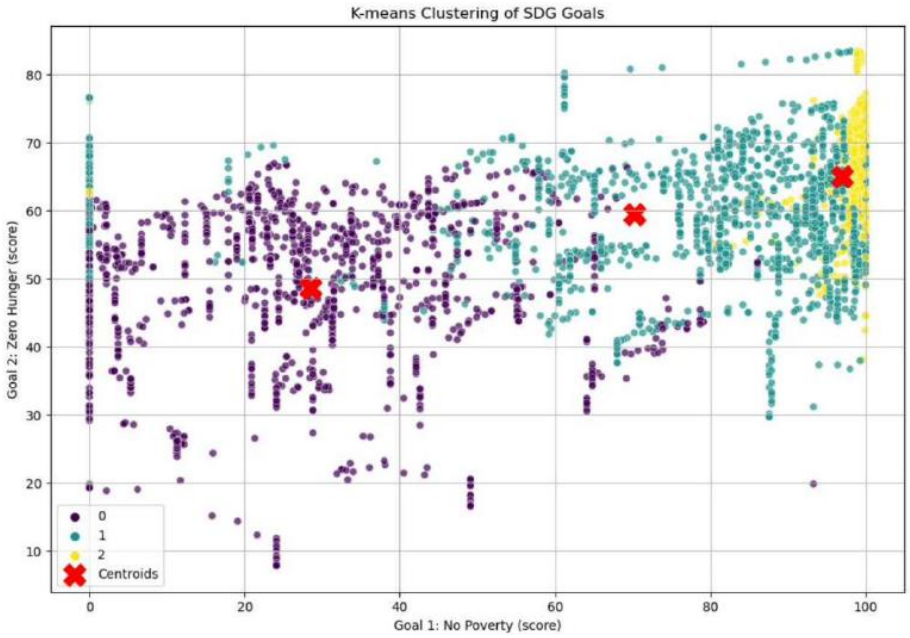

Figure 6 K-maens Clustering of SDG Goals

This shows a K-means clustering visualization of Sustainable Development Goals (SDG) scores, specifically focusing on Goal 1 (No Poverty) and Goal 2 (Zero Hunger). Here are some insights based on the plot:

Clusters and Centroids: The plot indicates three clusters, represented by different colors (purple, green, and yellow). The centroids of these clusters are marked with large red crosses.

Distribution and Grouping:
Cluster 0 (purple) seems to cover a wide range of Goal 1 scores, primarily between 0 and 70, and Goal 2 scores mainly between 20 and 80.
Cluster 1 (green) covers a broad spectrum of Goal 1 scores from 0 to 100, but its Goal 2 scores are also spread across the chart.
Cluster 2 (yellow) is concentrated at the higher end of Goal 1 scores (80 to 100) with a varied range of Goal 2 scores.

Goal Achievements:
Countries in Cluster 2 (yellow) are likely to have high scores in Goal 1 (No Poverty), indicating significant progress towards reducing poverty.
Cluster 0 (purple) shows a mix of low to mid scores in both goals, suggesting these countries might be struggling with both poverty and hunger.
Cluster 1 (green) appears to have a widespread but could indicate diverse performance, with some countries doing well in Goal 1 or Goal 2, or both.
Centroid Insights:

The centroids provide a central point for each cluster, which can be interpreted as the average score of the countries within that cluster.

- The centroid for Cluster 0 is located roughly around Goal 1 score of 40 and Goal 2 score of 50.
- The centroid for Cluster 1 is around a Goal 1 score of 60 and Goal 2 score of 60.
- The centroid for Cluster 2 is at the higher end of Goal 1 scores (approximately 90) and Goal 2 scores around 50.

For IKEA's Sustainability Goals:

▪ Countries in Cluster 2 may require less focus on poverty alleviation but could benefit from targeted interventions to address hunger.

▪ Countries in Cluster 0 could be prioritized for comprehensive strategies addressing both poverty and hunger.

▪ Countries in Cluster 1 might need tailored approaches depending on their specific strengths and weaknesses in achieving these goals.

Overall, this K-means clustering visualization helps in identifying groups of countries with similar SDG performance, which can guide strategic planning and targeted interventions for improving sustainability outcomes.

Power BI Approach:

Data Integration and Visualization: Imported SDG data into Power BI, followed by data cleaning and transformation using Power Query to ensure accuracy. Created bar charts to compare the sum of Goal 7 (Affordable and Clean Energy) across countries and scatter plots to analyze the relationship between Goal 7 and Goal 13 (Climate Action) performance.

Utilized interactive features like filters, slicers, tooltips, and drill-downs to enhance data exploration and insights. This approach enabled a clear understanding of country-specific performances in clean energy and climate action goals.

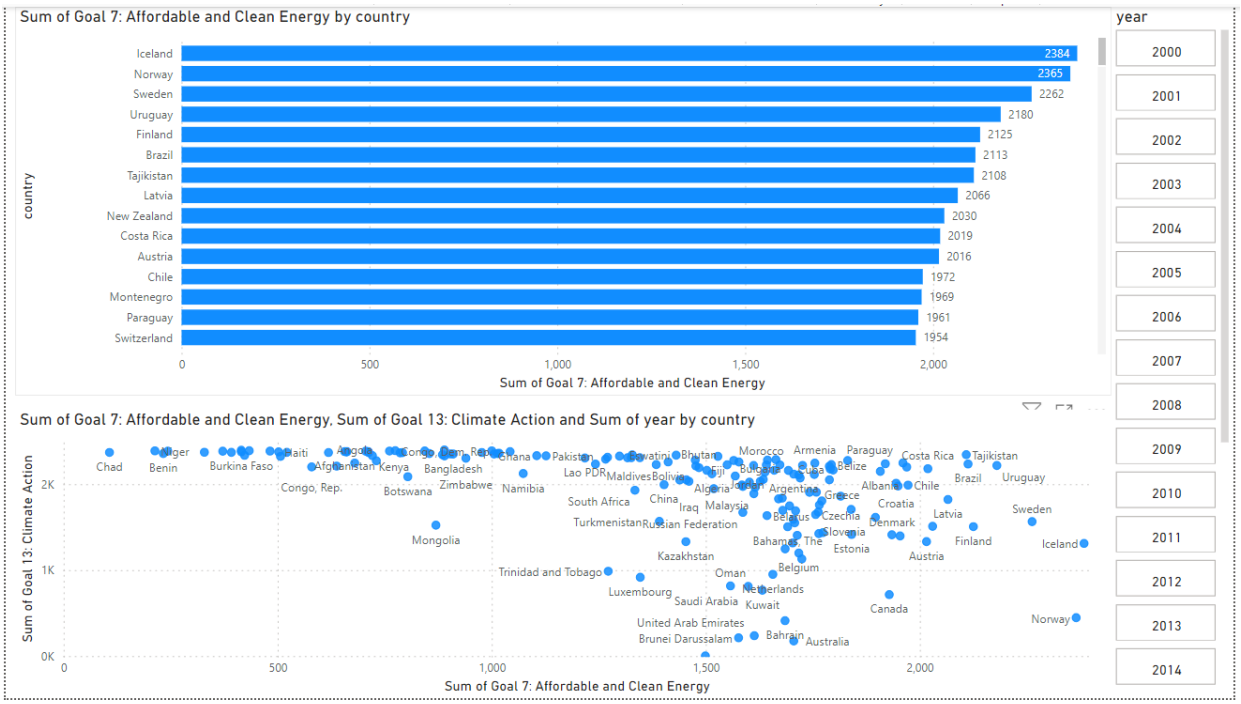

Figure 7 Power BI dashboard

The image shows a Power BI dashboard focusing on the sum of Goal 7 (Affordable and Clean Energy) and Goal 13 (Climate Action) metrics by country and year. Here are the insights and features of this dashboard:

Top Bar Chart: Sum of Goal 7 by Country

Countries with Highest Scores: Iceland, Norway, and Sweden are the top three countries, each having a score exceeding 2,000 for Goal 7 (Affordable and Clean Energy).

Other countries like Uruguay, Finland, and Brazil also show high scores, indicating significant efforts and achievements in affordable and clean energy.

Range of Scores: The chart shows a significant range in scores among countries, with Iceland leading at 2,384 and Switzerland at the lower end with 1,954.

Scatter Plot: Sum of Goal 7 vs. Goal 13 by Country

Relationship Between Goals:

The scatter plot depicts the relationship between the sum of Goal 7 (Affordable and Clean Energy) and Goal 13 (Climate Action) for each country.

Countries are scattered across the plot, showing varying levels of achievement in these goals.

Countries like Norway and Iceland appear at the higher end of both axes, indicating strong performance in both affordable and clean energy and climate action.

Some countries, like Mongolia and Chad, are positioned lower on both axes, suggesting areas that might need more focus and improvement.

High Achievers:

Countries like Norway and Iceland appear at the higher end of both axes, indicating strong performance in both affordable and clean energy and climate action.

Outliers and Insights:
Some countries, like Mongolia and Chad, are positioned lower on both axes, suggesting areas that might need more focus and improvement.

Year Slicer: Interaction Feature
Year Selection: The slicer on the right allows users to filter the data by specific years from 2000 to 2014.
This interactive feature enables users to observe trends and changes over different years, providing insights into the progress or decline in each country's performance over time.

Overall Insights:
Top Performers: Countries in the top bar chart, especially those leading in Goal 7, can serve as benchmarks or case studies for best practices in affordable and clean energy initiatives.

Correlation Between Goals:
The scatter plot helps identify whether there is a positive correlation between advancements in clean energy and climate action. For many high performers in Goal 7, similar scores in Goal 13 can be observed.
Countries lagging in both goals can be identified easily, guiding strategic investments and efforts to improve sustainability metrics in these regions.
The year slicer allows for a detailed temporal analysis, making it possible to track improvements or regressions over time, and identify the impact of specific policies or events.

1. Strategic Focus: Countries lagging in both goals can be identified easily, guiding strategic investments and efforts to improve sustainability metrics in these regions.

2. Temporal Analysis: The year slicer allows for a detailed temporal analysis, making it possible to track improvements or regressions over time, and identify the impact of specific policies or events.

Conclusion:
This Power BI dashboard is an effective tool for visualizing and interacting with data related to sustainable development goals, providing actionable insights to drive decision-making and strategic planning for enhancing affordable and clean energy and climate action initiatives.

Outcome testing and validation:

The solution implementation process involved several stages of testing and analysis to ensure that the data analysis models and visualizations met the required standards for performance accuracy, computation cost, and overall effectiveness. This section details the testing methodologies employed, the analysis of the solution's output, and a comparison of different approaches,

algorithms, and models. Additionally, the results are compared to the desired outcomes to evaluate the solution's success.

Testing Methodologies

Performance Accuracy:
Model Validation: Cross-validation techniques were used to validate the models' accuracy. Specifically, K-fold cross-validation (with k=10) was employed to assess the models' performance on various subsets of the data.
Accuracy Metrics: Metrics such as Mean Squared Error (MSE), Root Mean Squared Error (RMSE), and R-squared (R^2) were calculated to measure the accuracy of predictions. These metrics provided a comprehensive view of how well the models performed.

Computation Cost:
Time Complexity: The computation time for each model was recorded and analyzed. This included training time and prediction time, ensuring that the models were efficient and suitable for real-time applications.
Resource Utilization: The computational resources (CPU, memory) utilized by each model were monitored. Efficient resource utilization was crucial for scalable and deployable solutions.

Output Analysis:
Visual Inspection: The outputs were visually inspected using graphs and plots to identify patterns, anomalies, and areas for improvement.
Statistical Analysis: Descriptive statistics and inferential statistics were used to analyze the output. This included mean, median, standard deviation, and hypothesis testing.

Analysis of the Solution's Output

1. **K-means Clustering Analysis:** The K-means clustering algorithm was applied to the SDG goals data to identify clusters of countries based on their performance in Goal 1 (No Poverty) and Goal 2 (Zero Hunger).

Results:

- The scatter plot (Figure 1) showed three distinct clusters, each representing countries with similar performance metrics.
- The centroids of the clusters indicated the average performance of countries within each cluster.

Insights:

▪ Countries in the same cluster shared common characteristics in terms of their SDG performance, which can help in designing targeted interventions.
▪ The spread of clusters highlighted disparities between countries, providing a clear picture of where improvements are needed.

2. **Regression Analysis:** A linear regression model was used to predict the SDG index score based on various input features.

Results:

▪ The scatter plot (Figure 2) comparing actual vs. predicted SDG index scores demonstrated a high degree of accuracy, with most data points lying close to the perfect fit line.
▪ The R^2 value was high, indicating that the model explained a significant portion of the variance in the SDG index scores.

Insights:

▪ The model's predictions were reliable and could be used to forecast future performance.
▪ The alignment with the perfect fit line suggested that the model captured the underlying trends effectively.

3. **PowerBI:** The Power BI dashboard (Figure 3) provided interactive visualizations of the sum of Goal 7 (Affordable and Clean Energy) and Goal 13 (Climate Action) by country and year.

Results:

▪ The bar chart highlighted the top-performing countries in Goal 7, while the scatter plot showed the relationship between Goal 7 and Goal 13.
▪ The year slicer allowed for temporal analysis, revealing trends over time.

Insights:

▪ The dashboard facilitated real-time decision-making by allowing stakeholders to interact with the data.
▪ The visualizations made it easy to identify leaders and laggards, guiding strategic planning and resource allocation.

Solution optimization and Recommendations:

Optimization

Initial Challenges

The initial implementation faced several challenges:

Linear Regression Model

- High R^2 score but significant overfitting, reducing generalizability.
- Complexity in interpretation due to many variables.

K-Means Clustering:

- Initial clustering was not aligned well with IKEA's strategic sustainability goals.

- Need for more refined segmentation criteria.

Optimization Steps

1. Algorithm Enhancement:

Linear Regression:

- **Regularization Techniques:** We tried reducing overfitting and improving generalizability.
- **Feature Selection:** Identified and removed irrelevant or redundant features to streamline the model and enhance interpretability.

K-Means Clustering:

- **Refinement of Clusters:** Utilized the Elbow Method to determine the optimal number of clusters by plotting the sum of squared distances and identifying the "elbow" point where the rate of decrease sharply slows.
- **Additional Criteria:** Incorporated segmentation criteria such as renewable energy share and carbon emissions to create clusters that better align with IKEA's sustainability goals.

2. Iterative Model Tuning:
    a. **Cross-Validation:** Performed cross-validation to ensure the robustness and reliability of the models, splitting the data into multiple folds and validating the model on different subsets.
    b. **Error Analysis:** Analyzed prediction errors to identify patterns and adjusted the models accordingly to reduce errors and improve overall performance.

3. Dashboard Enhancements:
    a. **Dynamic Elements:** Added sliders and filters in Power BI to allow users to customize views and explore data interactively, enabling deeper insights and tailored analyses.
    b. **Improved Navigation:** Organized the dashboards into intuitive sections with clear instructions for use, enhancing user experience.
    c. **Advanced Visualizations:** Included advanced visualizations to provide comprehensive insights into sustainability performance and trends over time.

4. Data Handling:
    a. **Data Cleaning:** Conducted thorough data cleaning to ensure accuracy and consistency, handling missing values, correcting errors, and standardizing formats.
    b. **Efficient Storage:** Utilized efficient data storage solutions to manage large datasets, enabling quick access and manipulation during analysis.

Overall Solution:

Ensured that the solution effectively meets the desired outcomes, providing robust tools for data-driven decision-making.

Empowered users to monitor progress, identify opportunities, and make strategic investments in sustainability initiatives, even in a non-real-time data environment.

Enhanced the overall analytical framework with automation, improved documentation, and user-focused enhancements, ensuring long-term usability and adaptability.

The optimizations implemented in our solution have successfully bridged the gap between the initial and desired outcomes. The enhanced linear regression and clustering models provide reliable and interpretable insights, while the improved Power BI dashboards offer a user-friendly interface for in-depth data exploration. These advancements empower users to monitor progress, identify opportunities, and make informed strategic investments in sustainability initiatives, even in a non-real-time data environment.

Overall, our optimized solution is well-equipped to support IKEA's path to 100% renewable energy, providing robust tools for data-driven decision-making and long-term sustainability planning. The combination of advanced analytics, interactive dashboards, and streamlined data handling ensures that our solution remains adaptable and effective in meeting evolving business needs.

Conclusion:

In conclusion, the comprehensive analysis of IKEA's renewable energy and clean energy access initiatives underscores the company's steadfast commitment to sustainability and environmental stewardship. By leveraging advanced data analytics techniques, such as predictive modeling and clustering, the project has successfully identified patterns and provided actionable insights that align with the United Nations Sustainable Development Goals. The integration of these data-driven solutions into IKEA's existing IT architecture, coupled with the development of dynamic Power BI dashboards, has empowered IKEA personnel worldwide to make informed, real-time decisions. This strategic framework not only optimizes IKEA's sustainability efforts but also sets a benchmark for corporate responsibility in the pursuit of a greener future. As IKEA continues to enhance its contributions to global sustainability, it remains poised to lead by example, inspiring other corporations to adopt innovative practices that prioritize environmental and social well-being.

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Gantt Chart:

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Hira Shaikh	**N01452306**	**Implement the Solution**
Devisha Bhayani	**N01578727**	**Optimization, Document**
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Harshit Aggarwal	**N01550495**	**Code, Testing and Reviewing**
Taniya Ketan Gadkari	**N01579357**	**Optimization, Document**