

## Designing an Evaluation System for Climate Change Mitigation Policies using GPT-4

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# Designing an Evaluation System for Climate Change Mitigation Policies using GPT-4

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## Introduction

In the realm of addressing global warming, the development and implementation of effective policies play a pivotal role. Given the vast amount of legislative documents generated annually, it becomes imperative to have a system in place that can efficiently analyze these documents to identify measures aimed at climate change mitigation. This article outlines the design of an innovative system that employs GPT-4, a state-of-the-art language model developed by OpenAI, to evaluate climate change policy. The proposed system is designed to ingest legislative documents as input and utilize GPT-4 to identify, categorize, and evaluate the policies within these documents that are related to climate change mitigation efforts. The system would be capable of processing a wide range of document formats and languages, thanks to GPT-4's multimodal and multilingual capabilities.

## Functional Capabilities

- 1. Policy Identification:** The system would use GPT-4's advanced text analysis capabilities to scan through legislative documents, identifying sections and clauses that pertain to climate change mitigation efforts. This could include regulations on emissions, renewable energy initiatives, conservation projects, and more.
- 2. Contextual Analysis:** Beyond mere identification, the system would leverage GPT-4 to understand the context and implications of each identified policy measure. This involves evaluating the potential impact, scope, and alignment with international climate goals, such as those set forth in the Paris Agreement.
- 3. Comparative Evaluation:** Utilizing GPT-4's ability to compare and contrast text, the system could benchmark the identified policies against best practices and successful measures implemented in other jurisdictions. This would provide insights into the relative strength and potential effectiveness of each policy.
- 4. Recommendation Generation:** Based on the analysis, the system could use GPT-4 to generate recommendations for strengthening existing policies or suggesting new measures. This could be particularly useful for policymakers looking to enhance their country's climate change mitigation strategies.
- 5. Reporting:** Finally, the system would compile its findings and recommendations into comprehensive reports. These reports would be generated by GPT-4 in a clear, accessible language, making the insights gleanable not just by experts but also by the general public and other stakeholders.

While the proposed system holds great promise, several challenges and ethical considerations need to be addressed: (1) Data Privacy and Security. Ensuring the confidentiality and integrity of the legislative documents processed by the system is paramount. (2) Bias and Fairness. The system must be carefully designed to avoid biases in policy evaluation, particularly those that might stem from the training data used by GPT. (3) Accuracy and Reliability: While GPT-4 can provide high-level analysis and insights, the final evaluation and decision-making should involve human oversight to account for nuances and complexities that the model might overlook. The design of a GPT-4 based system for evaluating climate change mitigation policies represents a significant step forward in leveraging AI for environmental governance. By automating the analysis of legislative documents, such a system can provide valuable insights, driving more informed and effective policy-making in the fight against global warming.

### State of the Art in Large Language Models

The advent and evolution of Large Language Models (LLMs) have marked a significant epoch in the realm of artificial intelligence, particularly in the domain of natural language processing (NLP). These models, characterized by their profound computational capabilities and depth of learning, have substantially redefined the boundaries of language understanding and generation, paving new pathways for human-computer interaction and text analytics. The genesis of LLMs can be traced back to the early experiments in machine learning and NLP, where the foundational goal was to enable machines to comprehend and mimic human language. Over the years, this quest has seen the transition from simple rule-based algorithms to more sophisticated neural network architectures, such as Recurrent Neural Networks (RNNs) and, more pivotally, Transformer models, which have become synonymous with the current generation of LLMs.

The breakthrough came with the introduction of models like GPT (Generative Pretrained Transformer) and BERT (Bidirectional Encoder Representations from Transformers), which demonstrated unprecedented proficiency in a range of language tasks, from text completion to sentiment analysis and beyond. These models are distinguished not only by their size, in terms of the number of parameters, but also by their ability to learn and generalize from vast datasets, encompassing the breadth and complexity of human language.

One of the most compelling aspects of LLMs is their capacity for transfer learning. Pretrained on extensive corpora, these models can be fine-tuned with relatively smaller datasets to perform specific tasks, making them remarkably versatile and efficient. This attribute has unlocked new horizons in NLP applications, from automated content creation to sophisticated conversational agents and complex problem-solving tools. However, the ascent of LLMs is not without its challenges and ethical considerations. Issues such as bias in model outputs, the environmental impact of training large models, and the potential for misuse underscore the need for a balanced approach to the development and deployment of LLMs. Moreover, the interpretability of these models remains a critical area of research, as

the "black box" nature of deep learning systems poses questions about transparency and accountability.

In conclusion, the state of the art in LLMs embodies a dynamic and transformative phase in AI, with profound implications for various sectors. As we stand on the cusp of further innovations, the ongoing dialogue between technological advancement and ethical stewardship will undoubtedly shape the trajectory of LLMs in the years to come.

## Global Warming: An Overview

Global warming, a term that has found its way into the lexicon of nearly every discussion surrounding environmental conservation, climate change, and sustainability, refers to the long-term heating of Earth's climate system observed since the pre-industrial period (between 1850 and 1900) due to human activities, particularly fossil fuel burning, which increases heat-trapping greenhouse gas levels in Earth's atmosphere. This phenomenon is a primary aspect of climate change, which encompasses global warming and its wide-ranging effects. The scientific consensus on global warming is unequivocal, with extensive research and empirical data substantiating the rapid increase in global average surface temperatures. According to the Intergovernmental Panel on Climate Change (IPCC), the last few decades have seen unprecedented warming, with the last four decades being successively warmer than any decade that preceded them since 1850.

The primary drivers of global warming are anthropogenic emissions of greenhouse gases (GHGs) such as carbon dioxide (CO<sub>2</sub>), methane (CH<sub>4</sub>), and nitrous oxide (N<sub>2</sub>O), which enhance the greenhouse effect. Deforestation, industrial processes, and certain agricultural practices also contribute to the increased concentrations of these gases, further exacerbating the warming effect. The implications of global warming are far-reaching and perilous, affecting virtually every aspect of the Earth's environment and human society. The rising temperatures contribute to more frequent and severe weather events, such as hurricanes, heatwaves, and droughts, leading to widespread ecological and socio-economic disruptions. Melting polar ice caps and glaciers, rising sea levels, and the acidification of oceans pose significant threats to marine life and coastal communities.

Moreover, global warming is expected to have profound implications on food security, water resources, and human health. The alteration of precipitation patterns and the exacerbation of extreme weather events can disrupt agricultural productivity, leading to food shortages and increased malnutrition. Water scarcity, exacerbated by changing rainfall patterns, threatens the availability of fresh water for drinking, sanitation, and irrigation. The urgency to address global warming has never been greater. Mitigation strategies, including transitioning to renewable energy sources, enhancing energy efficiency, and implementing sustainable land use practices, are crucial to curbing the rise in global temperatures. International agreements, such as the Paris Agreement, aim to consolidate global efforts to combat climate change, setting ambitious targets to limit global warming.

In conclusion, global warming presents one of the most daunting challenges of our time, with its widespread and potentially irreversible impacts on the planet's climate system. The collective response of the international community, governments, corporations, and individuals will determine the future trajectory of global warming and its impact on generations to come.

To expand on the conclusion and delve deeper into the projects and initiatives actively addressing global warming on a global scale, I will discuss various international efforts aimed at understanding and mitigating this phenomenon. These efforts encompass scientific research, policy-making, technological innovations, and collaborative international agreements. Global warming, as one of the most pressing challenges of our era, commands a multifaceted response from the global community. The complexity and scope of its impacts necessitate a broad spectrum of strategies, ranging from scientific research to international policy and grassroots activism. Recognizing the urgency of the situation, various entities have mobilized to address the causes and consequences of global warming through a series of ambitious and innovative projects.

Organizations like the Intergovernmental Panel on Climate Change (IPCC) and the National Aeronautics and Space Administration (NASA) lead in climate science, providing critical data and models that enhance our understanding of climate change dynamics. Projects such as NASA's Earth Observing System (EOS) and the European Space Agency's (ESA) Copernicus program deploy satellites to monitor Earth's climate system, offering invaluable insights into temperature changes, ice mass balance, and atmospheric composition.

At the forefront of policy initiatives is the Paris Agreement, under the United Nations Framework Convention on Climate Change (UNFCCC), which unites nations in a collective effort to limit global warming to well below 2 degrees Celsius above pre-industrial levels. This agreement emphasizes the role of national determined contributions (NDCs), where each country outlines its own strategies for emission reduction and adaptation. Transitioning to renewable energy sources is pivotal in mitigating global warming. Projects like the International Renewable Energy Agency's (IRENA) Global Atlas for Renewable Energy and the Solar Impulse Foundation's 1000+ Solutions to protect the environment are instrumental in accelerating the adoption of clean energy technologies and decarbonizing the energy sector.

Projects aimed at reforestation and ecosystem conservation also play a crucial role in combating global warming. Initiatives like the Bonn Challenge and the Trillion Tree Campaign seek to restore degraded lands and forests, which are vital for carbon sequestration and biodiversity preservation. Innovation in sustainable development is crucial for addressing global warming. The Sustainable Development Solutions Network (SDSN), launched by the United Nations, works on practical solutions for sustainable development, including urban planning, sustainable agriculture, and resilient infrastructure that can withstand the impacts of climate change. At the end, grassroots movements like Fridays for Future and 350.org mobilize public opinion and advocate for strong climate

policies, emphasizing the role of individual and community action in driving systemic change.

In conclusion, addressing the multifaceted challenge of global warming requires a concerted effort that spans scientific research, policy formulation, technological innovation, and community engagement. The active projects and initiatives across the globe serve as a testament to the collective will to understand and combat this crisis. The future trajectory of global warming and its impact on subsequent generations hinge on the effectiveness, scalability, and inclusivity of these efforts.

### **Summary of GPT-4: state of the art**

The GPT-4 is a large-scale multimodal model designed by OpenAI. Unlike its predecessors, GPT-4 accepts both text and image inputs, producing text outputs, and showcases human-level performance on various professional and academic benchmarks, including achieving scores in the top 10% on simulated bar exams. This advancement is attributed to its Transformer-based architecture and a meticulous post-training alignment process that enhances its performance on measures of factuality and adherence to desired behaviors..

A significant focus of the GPT-4 project was on developing a deep learning infrastructure that ensures predictable scaling. This was achieved through optimization methods that maintain consistent behavior across different scales, enabling reliable predictions about GPT-4's performance based on smaller-scale models. This approach allowed for the anticipation of GPT-4's capabilities and limitations, facilitating better-informed decisions regarding alignment, safety, and deployment.

Despite its advancements, GPT-4 shares similar limitations with earlier GPT models, such as occasional reliability issues, including "hallucinations," and a fixed context window. These limitations underscore the importance of cautious application, especially in high-stakes contexts. To mitigate potential risks, the report details the implementation of a model-assisted safety pipeline, including adversarial testing with domain experts, to address and manage safety challenges effectively.

GPT-4's introduction of visual inputs marks a significant expansion in its application range, enabling it to process and generate text outputs based on a combination of text and images. This feature is demonstrated through examples where GPT-4 successfully interprets and responds to image-based prompts, showcasing its ability to handle tasks that require understanding of both visual and textual information.

### **Environmental, Social, and Governance (ESG) and Its Connection to Global Warming**

The concept of ESG, which stands for Environmental, Social, and Governance, has become a



cornerstone in assessing the sustainability and ethical impact of investments and business practices. This framework allows investors, companies, and regulatory bodies to evaluate the extent to which an organization addresses critical environmental challenges, manages relationships with employees, suppliers, customers, and communities, and upholds robust governance practices. The environmental component of ESG is directly linked to the issue of global warming, as it focuses on a company's performance as a steward of the natural environment. This includes how the organization mitigates its environmental footprint, particularly in terms of greenhouse gas emissions, resource depletion, waste management, and the preservation of natural habitats. As global warming represents one of the most pressing environmental challenges today, the manner in which businesses respond to this crisis is a significant aspect of their environmental responsibility.

In the context of global warming, the environmental criteria within the ESG framework encourage companies to adopt strategies that reduce their carbon footprint, enhance energy efficiency, and transition to renewable energy sources. Such measures not only contribute to mitigating the company's direct impact on the climate but also set a precedent for industry-wide practices, promoting a broader shift towards sustainability. Moreover, the ESG framework underscores the interconnectedness of environmental sustainability with social equity and effective governance. The social aspect examines how companies support social justice, employee relations, diversity, and inclusion, all of which can be influenced by the broader environmental policies a company adopts. Effective governance, on the other hand, ensures that companies are making decisions in a manner that is accountable and transparent, with long-term environmental sustainability being a key consideration.

The relevance of ESG to global warming lies in its holistic approach, which recognizes that the fight against global warming requires concerted efforts across all sectors of society. By integrating ESG principles, companies not only contribute to environmental preservation but also support a sustainable economic model that values social well-being and ethical governance. This alignment underscores the critical role of the corporate sector in addressing global warming and highlights the importance of ESG in steering both investments and business practices towards a more sustainable and equitable future.

### **Case study: ESG MAP**

We have carried out an analysis of the distribution of ESG values referring to properties (intended for residential use) in Italy. The model is based on two sources: (a) a database of approximately 90.000 appraisals and (b) a block of 27 'questions' (year of construction of the property ... or ... heating system supply).

By combining the two sources we can calculate an ESG score for each property unit. Since the appraisals are georeferenced, it is possible to associate geographical information with the scores, as well as the characteristics of the property.

Key findings are:

- **Geographic Influence:** ESG scores vary geographically, with northeast and northwest areas generally scoring higher than central and southern regions. This trend is consistent across different property types.
- **Cadastral Category Impact:** The cadastral category of a property influences its ESG score, although the exact nature of this impact is complex.
- **Market Value Correlation:** Surprisingly, in some regions, there is no correlation between property market value and ESG score. In other areas, this correlation varies, being either positive or negative.
- **Temporal Patterns:** From 2019 to 2023, distinct temporal patterns in ESG scores were observed in different geographical areas, including a general rise in ESG scores in 2023.

## Discussion

In the contemporary landscape of climate change research and policy formulation, Large Language Models (LLMs) have emerged as pivotal tools, offering novel insights and enhancing decision-making processes. As the urgency to address global warming intensifies, the integration of sophisticated AI technologies like LLMs into environmental studies represents a significant stride towards innovative solutions.

### ESGMap: use LLMs to compute ESG score from appraisals

As a case study of the potential of LLMs in evaluating policies in the context of the fight against global warming, we analyzed documents relating to the characteristics of the property, and we asked ChatGPT 4.0 to calculate an ESG scale score. LLMs have the capability to process and analyze vast amounts of textual data, including scientific papers, reports, and real-time data feeds. This capacity allows for the synthesis of complex climate information, enabling researchers to distill key findings and trends from an expansive array of sources. For instance, LLMs can be employed to review and summarize thousands of scientific articles on climate change, providing comprehensive overviews of current research findings and identifying gaps in knowledge.

Climate change is inherently a multi-disciplinary domain, intersecting with fields such as meteorology, oceanography, economics, and social sciences. LLMs facilitate cross-disciplinary research by integrating diverse data sets and fostering a unified understanding of climate change impacts. By analyzing literature and data across disciplines, LLMs help in constructing holistic models that capture the multifaceted nature of climate dynamics and its socio-economic implications.

In the realm of policy development, LLMs offer substantial support by analyzing policy documents, legal texts, and international agreements related to climate change. This analysis helps in identifying policy trends, understanding international commitments, and evaluating the effectiveness of existing regulations. LLMs can also aid policymakers in

drafting new policies by providing insights into the language and strategies that have been successful in past agreements.

## Other role of LLM in Climate Change Research and Policy Development

### Predictive Modeling and Scenario Analysis

LLMs contribute to predictive modeling by aiding in the generation of climate scenarios based on varying levels of greenhouse gas emissions and policy interventions. Through natural language processing, LLMs can assist in interpreting the outcomes of complex climate models, translating technical model outputs into accessible narratives that describe potential future states of the climate system under different policy pathways.

### Enhancing Public Engagement and Education

LLMs play a crucial role in translating complex climate science into understandable and engaging content for the general public. By generating informative articles, FAQs, and interactive dialogues, LLMs help in demystifying climate change and promoting wider public engagement. This educational role is vital for building public consensus around the importance of climate action and the need for urgent policy interventions.

### Future Directions

As LLMs continue to evolve, their application in climate change research and policy is expected to expand, offering more sophisticated tools for data analysis, predictive modeling, and stakeholder engagement. Collaborations between AI experts and climate scientists are crucial for advancing these models, ensuring they are tailored to address the specific challenges posed by global warming.

In conclusion, the integration of Large Language Models into climate change research and policy development represents a promising convergence of technology and environmental science. By harnessing the power of LLMs, researchers, policymakers, and advocates can enhance their understanding of climate dynamics, improve the formulation of effective policies, and foster greater public engagement in climate action.

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