# Sustainability AI copilot: Analyze & ideate at scale to enable positive impact

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## Abstract

With the advances in large scale Foundation Models, web scale access to 1 2 sustainability data, planetary scale satellite data, the opportunity for larger section 3 of the world population to create positive climate impact can be activated by 4 5 empowering everyone to ideate via AI copilots. The challenge is: How to enable more people to think & take action on climate & Sustainable Development goals?. 6 We develop AI co-pilots to engage broader community for enabling impact at 7 scale by democratizing climate thinking & ideation tools. We demonstrated how 8 ideating with SAI transforms any seed idea into a holistic one, given the relation 9 between climate & social economic aspects. SAI employs Language Models to 10 represent the voice of the often neglected vulnerable people to the brainstorming discussion for inclusive climate action. We demonstrated how SAI can even create 11 another AI that learns geospatial insights and offers advice to prevent 12 13 humanitarian disasters from climate change. In this work, we conceptualized, designed, implemented & demonstrated Sustainability AI copilot (SAI) & 14 innovated 4 use cases:- SAI enables sustainability enthusiasts to convert early 15 stage budding thoughts into a robust holistic idea by creatively employing a chain 16 17 of Large Language Models to think with six-thinking hats ideation. SAI can 18 enables non-experts to become geospatial analysts by generating code to analyze 19 planetary scale satellite data. SAI also ideates in multi-modal latent space to 20 explore climate friendly product designs. SAI also enables human right activists 21 to create awareness about inclusion of vulnerable and persons with disability in 22 the climate conversation. SAI even creates AI apps for persons with disability. We 23 prototypes project demonstrated working at the website. 24 https://sites.google.com/view/climate-copilot. Thus, SAI co-pilot empowers 25 everyone to come together to ideate to make progress on climate and related 26 sustainable development goals.

Keywords: Climate action, Sustainable Development Goals, Persons with
 Disability, Climate disasters, Humanitarian action, Generative AI, Human
 Computer Interaction, AI co-pilot, Large Language Models, Geospatial AI,
 Vision-Language modelling, Multimodal AI

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# 31 **1** Motivation

32 The potential to engage a larger percentage of world population to take action on climate & 33 related goals can be unlocked by democratizing access to various enablers. The challenge is how to 34 enable more people to take initiatives to make holistic progress on climate goals and related socio-35 economic goals. The opportunity to democratize access to avenues to accelerate progress on 36 sustainable development could be activated by conceiving an AI copilot. This paper envisions such 37 an AI copilot to lead anyone interested to contribute climate initiatives. The paper developed and implemented Sustainability AI copilot (SAI) with various innovative features aimed for 38 39 democratizing access to enable people. We showcase working demos of SAI on four use cases at 40 the SAI project website. Inaddition to the demonstration on four use cases, SAI also addressed the 41 following challenges.

42	Engage	wider set of partners for larger scale of impact by democratization of enablers:
43	0	Challenge: How to enable more people to think & take action on climate?. [5,6]
44	0	We designed & implemented AI co-pilots to engage broader community to enable
45		larger scale of impact by democratizing climate thinking, so everyone including the
46		non-experts can participate in taking initiatives.
47	Nurture	your seed ideas to mature ideas for social economic progress with climate action:
48	0	Challenge: As users come up with early ideas in their mind, can they use SAI to ideate
49		various ways to improve the idea? [4-6]
50	0	Ideating with SAI transforms user's seed idea into a holistic one as SAI employs chain
51		of Large Language Models (LLM) to think & enable progress on each of the 17
52		Sustainable Development Goals (SDG). SAI uses a RCI chain (Recursive Critique
53		Improvement) [23] on 17 SDG goals to continually refine and shape ideas.
54	• Inclusiv	e representation for Climate justice:
55	0	Challenge: Vulnerable people are most impacted by climate change, but is their voice
56		being heard as one thinks about sustainability initiatives?. How can we involve People
57		from financially poor areas, and person with disability?. [7-12]
58	0	SAI employs Large Language Models (LLM) to role play, thus represent the "spirit"
59		of vulnerable people in the brainstorming table. [11]
60	• Multi-m	nodal brainstorming:
61	0	Challenge: Can ideation happen in a combination of visual and language modalities?
62	0	SAI copilot experiments with multimodal latent space arithmetic [25] to generate
63		sustainable product designs.
64	• Enable	climate enthusiasts to create AI that gathers climate insights:
65	0	Challenge: How can an AI generate another AI project?. Imagine a LLM that
66		understands the causes of a climate disaster from a news article, then creates a
67		geospatial software by code-generation to identify geospatial insights behind a
68		disaster. Is it feasible to create such a copilot?
69	0	We implemented AI copilot that thinks about the approach to solve a climate problem.
70		The AI not only generates the approach to analyze a climate disaster, but creates
71		algorithm and generate source code to extract insights from satellite datasets and
72		finally advices to prevent humanitarian crisis. Thus, SAI looks at climate problems,
73		and creates AI python code that learns geospatial patterns [19-21] for a specific
74		problem, and forecasts/advices climate related humanitarian risks. Thus everyone
75		(including non-developers) can use SAI to avert humanitarian losses from climate
76		disasters.

- SAI is designed as an AI copilot, and it illustrates the potential to engage broader ecosystem to
   empower wider action on climate & Sustainable Development Goals. Working prototypes of SAI is
- 79 demonstrated at the project website at this URL, <u>https://sites.google.com/view/climate-copilot</u>.
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# 2 Design & implementation of Sustainability AI co-pilot prototypes

82 Sustainability AI copilot (SAI) is designed and implemented for 4 use cases in this paper. 83 Working demos of these 4 solutions are showcased at the SAI project website at https://sites.google.com/view/climate-copilot. We also open-source the contributions. 84 Bv 85 democratizing, larger percentage of users can be encouraged to think about new ideas and nurture 86 them. While SAI presents a simplified user experience to enable mainstream users, SAI taps into 87 the advances in AI such as Large Language Models (LLM), Deep Learning on planetary scale geospatial data, chains of multiple LLMs, Multimodal LLMs, vision-language models, LLM code-88 89 generation. We demonstrated SAI on the following four use cases.

- 90 SAI enables more climate enthusiasts to ideate & develop new ideas: By combining a chain of 1. 91 LLMs to review & refine a budding idea for different points of view of across SDG, we get the set of LLMs to think collectively to refine an primitive idea into a robust idea (initiative) as per 92 93 the six thinking hats brainstorming methodology. (e.g. "Your idea is good, but your idea can be 94 refined this way, so that it also positively impact both SDG#1 & SDG#13"). In addition, SAI 95 employs the power of Large Language Models (LLMs) and langchain tools to understand 96 sustainability reports published by various companies and identifies the documented best 97 practices with Retrieval Augmented Generation (RAG) [27] by scanning through sustainability 98 reports with vector search. As companies are required to report out their sustainability plan in 99 machine readable format in CSRD, best practices can be distilled by analyzing CSRD reports 100 [1-3]. Also, SAI uses OpenAI's Function Calling functionality to identify agents to delegate 101 workload based on type of task in hand, and maps common messages across multiple sources 102 using conversational chat memory. A video demonstration of SAI is contributed at the project 103 website.
- 104 2. Humanitarian volunteers may use SAI to auto-generate AI solutions to act swiftly to prevent 105 loss of human lives during climate disasters: Climate community can use SAI to protect 106 vulnerable populations from natural disasters. In the SAI project website, we demonstrate how 107 SAI generates AI solutions in-turn that learns geospatial patterns from one disaster, then leverage those patterns to find other risk areas. SAI creates "AI generated climate 108 109 investigations" to support climate adaptation & humanitarian action to protect vulnerable 110 people by auto-generating the approach, algorithms, source code [26] for Deep Learning 111 analysis of geospatial data [19-21]. SAI's RAG looks up climate disaster related news on the 112 web, and then suggests areas of investigation to climate researchers. In the SAI project website, 113 we demonstrate how SAI reads articles about recent floods caused by Glaciers lake outbursts, 114 and then suggests investigations using geospatial datasets to identify future flood risks. A video 115 demo is presented in project website.
- 3. Multimodal brainstorming by SAI copilot to create sustainable product design ideas: By applying multimodal latent space arithmetic, ideation can happen in a combination of vision and language modality [15,16]. SAI employs multimodal latent space addition across vision and language modality to enable multimodal ideation & refinement. Inaddition, SAI also employed a combination of GPT3.5 and DALL-E to create visualizations of sustainable designs. The project website also demonstrates this feature of SAI.
- 122 4. SAI copilot for innovating solutions for persons with disability & enable disability inclusive 123 *climate action:* SAI copilot can ideate by empathizing with the needs of vulnerable persons 124 with disability, and then create "AI app prototypes" to create innovative solutions. To enable 125 persons with visual impairment, SAI generated a prototype of AI solution to identify emergency 126 exits during emergencies using Visual Question Answering (VOA) using Vision Language 127 PreTrained Transformers (VLM) with ViLT/GiT [15-18]. To enable persons with low vision, 128 SAI empathized the need, and generated source code for prototyping AI apps with grounded 129 visual document question answering using large scale vision language models (LVLM) with 130 QWEN-VL [15-18].

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### 132 **3 Summary & Future**

133 As the challenge on climate requires enormous collective will by a broad set of stakeholders, 134 this paper created novel AI copilot to involve and engage a wider set of mainstream population 135 across countries. The strategy we employed is to democratize enablers for wider participation. In 136 this paper, we conceptualized, designed and implemented AI based copilots to guide anyone 137 (including newbies) to brainstorm & create ideas and initiatives to make progress on climate goals, 138 corporate sustainability goals, and make holistic progress on UN Sustainable Development Goals. 139 A copilot can engage broader participation. We envisioned Sustainability AI copilot (SAI) and 140 demonstrated the following in this paper.

- We demonstrated how SAI can turn seed ideas into mature ideas. We demonstrated how SAI ideates for holistic progress on climate action & related social economic factors. By chaining a set of LLMs, and by having a LLM critique the current version of idea across SDG factors, and then refine the ideas to be holistic, the climate community can collaborate with AI to make progress on climate and related Sustainable Development Goals. With prompting strategies, LLM "wear" various color hats as per six thinking hats framework.
- We demonstrated how SAI enables inclusive climate action by refining ideas based on the needs and aspirations of the vulnerable such as financially poor and persons with disability. LLM role plays as person with disability to develop the ideas into initiatives that are inclusive. The project website demonstrate how ideas are nurtured to make progress on both climate and social economic factors.
- We demonstrated how SAI think in multimodal space, thus brainstorming ideas in a combination of text and visual modality to create sustainable product designs.
- We demonstrated how SAI can generate "AI solutions" that solve climate challenges. In the specific example demonstrated in the project website, we showed how AI learns geospatial patterns on Glacier Lake Outburst flooding, and then provide advices to avert future humanitarian losses.
- We demonstrated how SAI can create novel AI solutions for enabling persons with disabilities by empathizing with different personas and then solve their challenges.
- All these innovations are demonstrated at the SAI project website. The project website is
   <u>https://sites.google.com/view/climate-copilot/</u>.
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#### 164 **References**

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- [1] Yosifova, D., & Petrova-Kirova, M. (2022). The New EU Corporate Sustainability Reporting Framework
   in the context of GRI Standards. *Economic and Social Development: Book of Proceedings*, 85-95.
- [2] Herzig, C., & Schaltegger, S. (2011). Corporate sustainability reporting. *Sustainability communication: Interdisciplinary perspectives and theoretical foundation*, 151-169.
- 170 [3] Purvis, A., & Hector, A. (2000). Getting the measure of biodiversity. *Nature*, 405(6783), 212-219.
- [4] Fuso Nerini, F., Sovacool, B., Hughes, N., Cozzi, L., Cosgrave, E., Howells, M., ... & Milligan, B. (2019).
  Connecting climate action with other Sustainable Development Goals. *Nature Sustainability*, 2(8), 674-680.
- 173 [5] Soergel, B., Kriegler, E., Weindl, I., Rauner, S., Dirnaichner, A., Ruhe, C., ... & Popp, A. (2021). A
- 174 sustainable development pathway for climate action within the UN 2030 Agenda. *Nature Climate Change*, 11(8), 656-664.
- [6] Zhenmin, L., & Espinosa, P. (2019). Tackling climate change to accelerate sustainable development. *Nature Climate Change*, 9(7), 494-496.
- 178 [7] Kosanic, A., Petzold, J., Martín-López, B., & Razanajatovo, M. (2022). An inclusive future: disabled

179 180	populations in the context of climate and environmental change. Current Opinion in Environmental Sustainability, 55, 101159.
181 182 183 184	[8] Tjoa, A. M., & Tjoa, S. (2016). The role of ICT to achieve the UN sustainable development goals (SDG). In <i>ICT for Promoting Human Development and Protecting the Environment: 6th IFIP World Information Technology Forum, WITFOR 2016, San José, Costa Rica, September 12-14, 2016, Proceedings 6</i> (pp. 3-13). Springer International Publishing.
185	
186 187	[9] Sanchez Rodriguez, R., Ürge-Vorsatz, D., & Barau, A. S. (2018). Sustainable Development Goals and climate change adaptation in cities. <i>Nature Climate Change</i> , 8(3), 181-183.
188	
189 190 191	[10] Creutzig, F., Roy, J., Lamb, W. F., Azevedo, I. M., Bruine de Bruin, W., Dalkmann, H., & Weber, E. U. (2018). Towards demand-side solutions for mitigating climate change. <i>Nature Climate Change</i> , 8(4), 260-263.
192	
193 194	[11] Jodoin, S., Buettgen, A., Groce, N., Gurung, P., Kaiser, C., Kett, M., & Youssefian, E. (2023). Nothing about us without us: The urgent need for disability-inclusive climate research. <i>PLOS Climate</i> , <i>2</i> (3), e0000153.
195	
196 197	[12] Stein, P. J., Stein, M. A., Groce, N., & Kett, M. (2023). The role of the scientific community in strengthening disability-inclusive climate resilience. <i>Nature Climate Change</i> , <i>13</i> (2), 108-109.
198	
199 200	[13] Thirunavukarasu, A. J., Ting, D. S. J., Elangovan, K., Gutierrez, L., Tan, T. F., & Ting, D. S. W. (2023). Large language models in medicine. <i>Nature medicine</i> , 1-11.
201	
202	[14] Sanderson, K. (2023). GPT-4 is here: what scientists think. <i>Nature</i> , 615(7954), 773.
203	
204 205 206	[15] Pan, Z., Zhou, X., & Tian, H. (2023). Arbitrary style guidance for enhanced diffusion-based text-to-image generation. In <i>Proceedings of the IEEE/CVF Winter Conference on Applications of Computer Vision</i> (pp. 4461-4471).
207	
208 209	[16] Kim, W., Son, B., & Kim, I. (2021, July). Vilt: Vision-and-language transformer without convolution or region supervision. In <i>International Conference on Machine Learning</i> (pp. 5583-5594). PMLR.
210	
211 212	[17] Wang, J., Yang, Z., Hu, X., Li, L., Lin, K., Gan, Z., & Wang, L. (2022). Git: A generative image-to-text transformer for vision and language. <i>arXiv preprint arXiv:2205.14100</i> .
213	
214 215	[18] Bai, J., Bai, S., Yang, S., Wang, S., Tan, S., Wang, P., & Zhou, J. (2023). Qwen-vl: A frontier large vision-language model with versatile abilities. <i>arXiv preprint arXiv:2308.12966</i> .
216	
217 218	[19] Holcomb, A., Dales, M., Ferris, P., Jaffer, S., Swinfield, T., Eyres, A., & Madhavapeddy, A. (2023). A Case for Planetary Computing. <i>arXiv preprint arXiv:2303.04501</i> .
219 220 221	[20] Karra, K., Kontgis, C., Statman-Weil, Z., Mazzariello, J. C., Mathis, M., & Brumby, S. P. (2021, July). Global land use/land cover with Sentinel 2 and deep learning. In <i>2021 IEEE international geoscience and remote sensing symposium IGARSS</i> (pp. 4704-4707). IEEE.
222 223	[21] Asyrofi, R., Dewi, M. R., Lutfhi, M. I., & Wibowo, P. (2023, August). Systematic Literature Review Langchain Proposed. In 2023 International Electronics Symposium (IES) (pp. 533-537). IEEE.
224	
225	[22] Qin, Y., Liang, S., Ye, Y., Zhu, K., Yan, L., Lu, Y., & Sun, M. (2023). Toolllm: Facilitating large

226 language models to master 16000+ real-world apis. *arXiv preprint arXiv:2307.16789*.

- [23] Kim, G., Baldi, P., & McAleer, S. (2023). Language models can solve computer tasks. arXiv preprint
   arXiv:2303.17491.
- [24] Göçmen, Ö., & Coşkun, H. (2019). The effects of the six thinking hats and speed on creativity in brainstorming. Thinking Skills and creativity, 31, 284-295.
- [25] Girdhar, Rohit, et al. "Imagebind: One embedding space to bind them all." Proceedings of the IEEE/CVF
   Conference on Computer Vision and Pattern Recognition. 2023.
- [26] Dong, Y., Jiang, X., Jin, Z., & Li, G. (2023). Self-collaboration Code Generation via ChatGPT. arXiv preprint arXiv:2304.07590.
- [27] Manathunga, S. S., & Illangasekara, Y. A. (2023). Retrieval Augmented Generation and Representative
   Vector Summarization for large unstructured textual data in Medical Education. arXiv preprint
   arXiv:2308.00479.

## 239 Appendix

Figure 1 (A):

