

Driving Down CO₂ Emissions and Electricity Costs: Unveiling the Power of Transportation-Based Microgrids

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Introduction

Methodology

Results

Conclusions and Future Work



► Electrification of Transportation

- Electric vehicle (EV) adoption is increasing rapidly, with 25.4% of Q2 2023 vehicle sales being EVs in California
- California aims to ban the sale of internal combustion engine vehicles by 2035
- The state is expanding its EV charging infrastructure, with over 13,844 Level 2 and 1,924 Level 3 stations as of November 2023
- Technological advances allow new EVs to charge up to 80% in 20-60 minutes, making EVs more appealing
- This rapid charging capability poses challenges for grid operators due to the high electricity demand it creates

► Challenges

- Two key challenges exist:
 - Providing enough electricity capacity for the growing number of EVs
 - Minimizing the CO₂ emissions associated with battery electric vehicles by ensuring a clean grid

► **Solution**

- Microgrids offer a potential solution to both challenges
- Microgrids can integrate renewable energy sources and EV charging stations, reducing the burden on the main grid and minimizing CO₂ emissions

► **Research Focus**

- Further research is needed to understand the economic and environmental impacts of EV charging, especially fast charging, and how microgrids can be effectively utilized to manage EV demand and promote a sustainable transportation future

Purpose and Contributions

- ▶ This research holds significant implications for the advancement of intelligent transportation systems, as it aims to address the economic needs of EV charging infrastructure owners and determine the optimal configuration that benefits both EV owners and the environment by minimizing greenhouse gas emissions
- ▶ This paper delves into the impacts of transportation-microgrids equipped with Level 2 and Level 3 charging on the behavior of microgrids, associated electricity costs, and CO₂ emissions within the context of southern California
- ▶ The simulations are conducted using OpenModelica, a dynamic modeling and simulation environment
- ▶ This study distinguishes itself from previous research in many ways, including employing a higher time resolution for calculating CO₂ emissions that is measured every 15 minutes and updated net energy metering rates for Riverside Public Utility

Microgrid Setup in OpenModelica

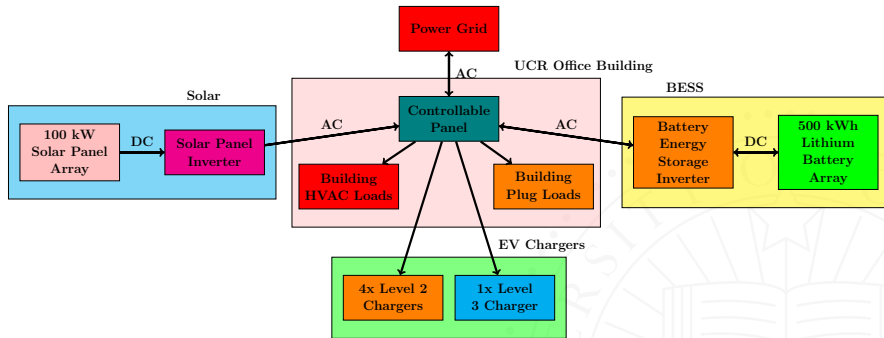


Figure: Microgrid Architecture of our Case Study Example BESS: Battery Energy Storage System

Level 2 Chargers Number of Sessions in One Year

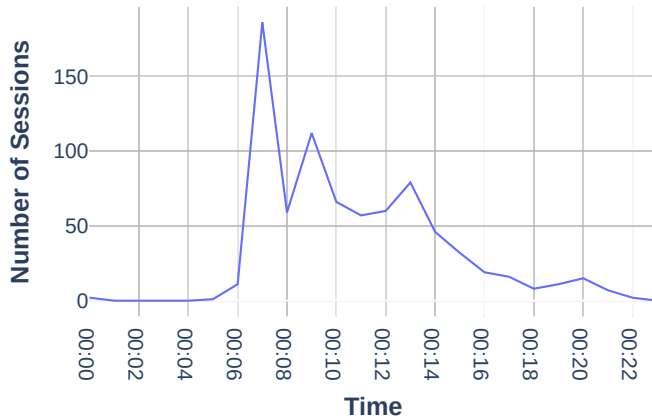


Figure: Level 2 EV Charger Probability Density Function Created by Using Actual Charging Data Obtained from a SCADA System

- ▶ The charging setup is modified in OpenModelica for different layouts and scenarios
- ▶ The scenarios are described in Table 1

Table: Simulated Scenarios of the UCR Microgrid using Different Layouts and Electric Pricing Structures

Scenario	
1	Standard Building with no EV Chargers
2	Standard Building with Level 2 Charging
3	Standard Building with Level 2 and Level 3 Charging
4	Microgrid Building with 100 kW Solar, 500 kWh BESS, and No EV Charging
5	Microgrid Building with 100 kW Solar, 500 kWh BESS, and Level 2 Charging
6	Microgrid Building with 100 kW Solar, 500 kWh BESS, Level 2, and Level 3 Charging
7	Microgrid Building with 100 kW Solar, 1 MWh BESS, and Level 2 Charging
8	Microgrid Building with 100 kW Solar, 1 MWh BESS, Level 2, and Level 3 Charging

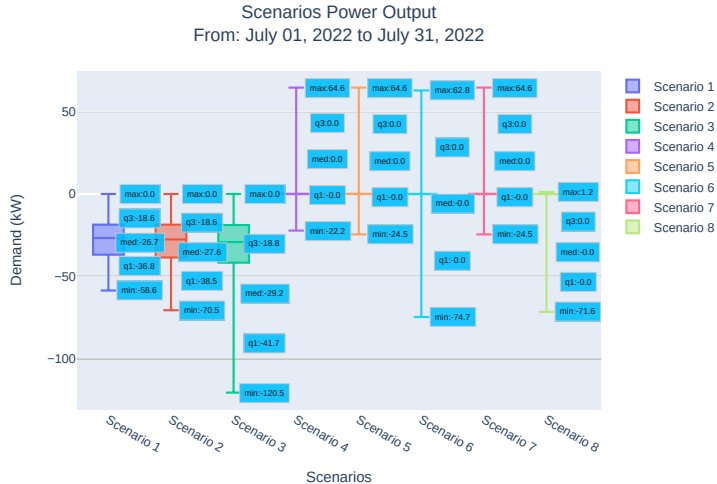


Figure: Power Measured from the Meter for the Month of July

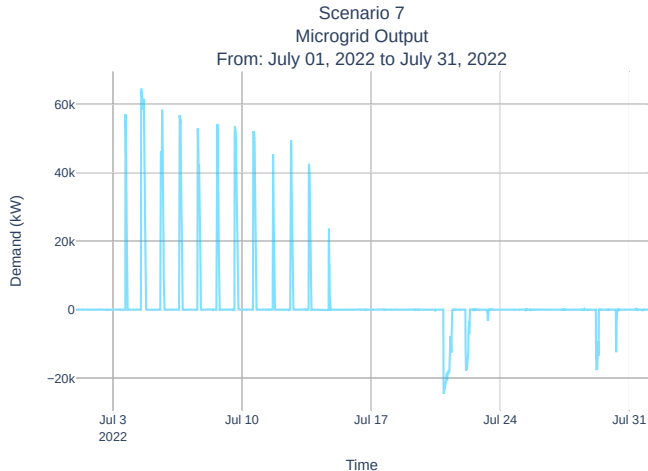


Figure: Peak Shaving Failure after Battery Depletion (Level 2 Charging, 500 kWh BESS)

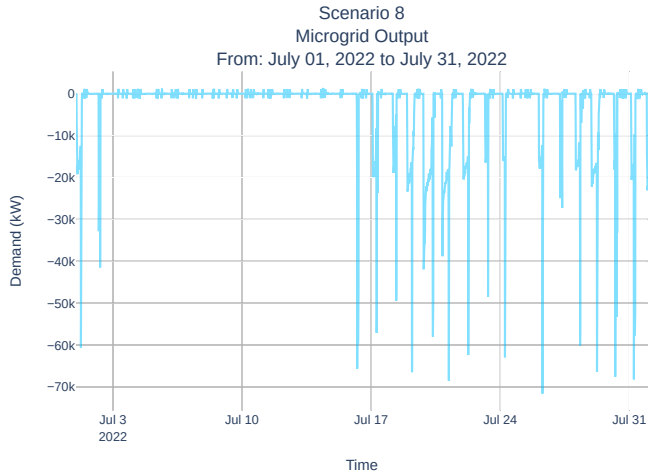


Figure: Peak Shaving Failure after Battery Depletion (Level 2 and Level 3 Charging, 500 kWh BESS)

Table: Microgrid Utility Prices and CO₂ Emissions Output under Different Pricing Scenarios and Pricing Structures

Scenario	Demand Charges (\$)	Energy Charges (\$)	Total Cost (\$)	Emissions
1	6616	22736	29352	34
2	8196	24607	32803	37
3	14235	29693	43928	43
4	3887	2387	6274	5
5	5133	3853	8986	7
6	11329	8238	19567	14
7	5022	3814	8836	7
8	11400	8133	19533	14

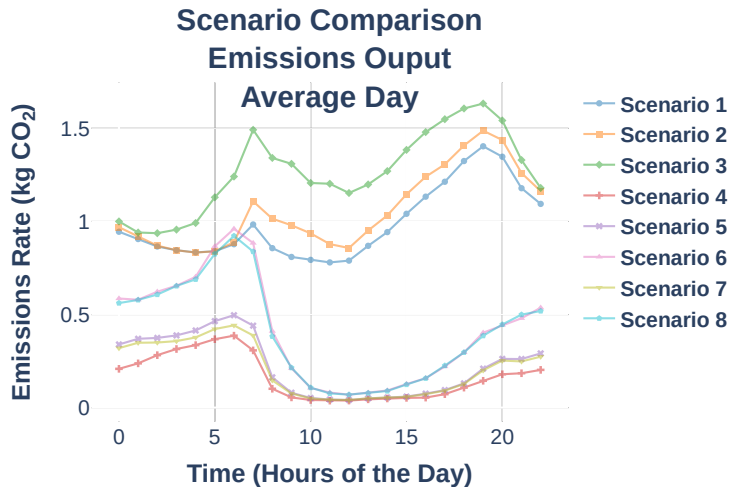


Figure: Microgrid CO₂ Emissions Outputs Averages During Times of Day: Adding a microgrid significantly reduces CO₂ Emissions compared to the non-microgrid scenarios of 1, 2, and 3.

Conclusions and Future Work I

▶ **Transportation Microgrids Benefits:**

▶ Reduced Electricity Costs:

- ▶ Load-Following Algorithm: \$23,000 - \$24,000 annual savings
- ▶ Cost of Demand Saved: Follows total cost trend (around \$3,000)
- ▶ Cost of Energy Saved: Follows total cost trend (around \$21,000)

▶ Reduced CO₂ Emissions:

- ▶ Load-Following Algorithm: 67% - 85% reduction (30 tons CO₂/year)

▶ **Key Considerations for Optimization:**

▶ Balance Clean Energy Sources (Solar/Wind) with Load:

- ▶ Level 2 chargers: manageable for office buildings
- ▶ Level 3 fast chargers: require additional clean energy sources

▶ Net Energy Metering Policy:

- ▶ Incentivizes low CO₂ load-following operation of a microgrid instead of peak-shaving

▶ Battery Capacity (BESS):

- ▶ Increased capacity for extreme solar outages is expensive with diminishing returns on CO₂/cost savings
- ▶ Requires additional solar power for full battery charge during daylight

▶ **Effective Microgrid Planning:**

- ▶ Requires all three aspects:
 - ▶ Clean Energy Generation
 - ▶ Energy Storage
 - ▶ Load Management

▶ **Future Work**

- ▶ Explore advanced control strategies for optimizing electric costs and CO₂ emissions in transportation-microgrid.
- ▶ Assess effects of new net energy metering policy in California on BESS system value.
- ▶ Analyze impact of different time-of-use (TOU) rates in California on electric costs and CO₂ emissions.
- ▶ Investigate methods to maximize clean energy utilization and minimize grid power during high CO₂ times.

Questions?



Thank You



- [1] S. o. California, “California releases world’s first plan to achieve net zero carbon pollution,” Nov 2022. [Online]. Available: <https://www.gov.ca.gov/2022/11/16/california-releases-worlds-first-plan-to-achieve-net-zero-carbon-pollution/>
- [2] PowerFlex, “California energy commission mandates new buildings must have solar storage,” Jan 2023. [Online]. Available: <https://www.powerflex.com/blog/california-energy-commission-mandates-that-new-buildings-must-have-solar-storage/>
- [3] [Online]. Available: <https://www.eia.gov/todayinenergy/detail.php?id=56880>
- [4] [Online]. Available: https://www.caiso.com/Documents/FlexibleResourcesHelpRenewables_FastFacts.pdf
- [5] M. Roslan, M. Hannan, P. J. Ker, R. Begum, T. I. Mahlia, and Z. Dong, “Scheduling controller for microgrids energy management system using optimization algorithm in achieving cost saving and emission reduction,” *Applied Energy*, vol. 292, p. 116883, 2021.

- [6] M. Azimian, V. Amir, and S. Javadi, “Economic and environmental policy analysis for emission-neutral multi-carrier microgrid deployment,” *Applied Energy*, vol. 277, p. 115609, 2020.
- [7] F. H. Aghdam, N. T. Kalantari, and B. Mohammadi-Ivatloo, “A stochastic optimal scheduling of multi-microgrid systems considering emissions: A chance constrained model,” *Journal of Cleaner Production*, vol. 275, p. 122965, 2020.
- [8] A. Heydari, D. A. Garcia, F. Keynia, F. Bisegna, and L. De Santoli, “Renewable energies generation and carbon dioxide emission forecasting in microgrids and national grids using grnn-gwo methodology,” *Energy Procedia*, vol. 159, pp. 154–159, 2019.
- [9] B. V. Solanki, K. Bhattacharya, and C. A. Canizares, “A sustainable energy management system for isolated microgrids,” *IEEE Transactions on Sustainable Energy*, vol. 8, no. 4, pp. 1507–1517, 2017.

- [10] H. U. R. Habib, A. Waqar, A. K. Junejo, M. M. Ismail, M. Hossen, M. Jahangiri, A. Kabir, S. Khan, and Y.-S. Kim, “Optimal planning of residential microgrids based on multiple demand response programs using abc algorithm,” *IEEE Access*, vol. 10, pp. 116 564–116 626, 2022.
- [11] X. Zhong, W. Zhong, Y. Liu, C. Yang, and S. Xie, “Optimal energy management for multi-energy multi-microgrid networks considering carbon emission limitations,” *Energy*, vol. 246, p. 123428, 2022.
- [12] M. M. Gamil, S. Ueda, A. Nakadomari, K. V. Konneh, T. Senjyu, A. M. Hemeida, and M. E. Lotfy, “Optimal multi-objective power scheduling of a residential microgrid considering renewable sources and demand response technique,” *Sustainability*, vol. 14, no. 21, p. 13709, 2022.

- [13] J. Garrido, M. J. Barth, L. Enriquez-Contreras, A. J. Hasan, M. Todd, S. Ula, and J. Yusuf, “Dynamic data-driven carbon-based electric vehicle charging pricing strategy using machine learning,” in *2021 IEEE International Intelligent Transportation Systems Conference (ITSC)*. IEEE, 2021, pp. 1670–1675.
- [14] L. F. Enriquez-Contreras, A. J. Hasan, J. Yusuf, J. Garrido, and S. Ula, “Microgrid demand response: A comparison of simulated and real results,” in *2022 North American Power Symposium (NAPS)*. IEEE, 2022, pp. 1–6.
- [15] A. J. Hasan, L. F. Enriquez-Contreras, J. Yusuf, and S. Ula, “A comprehensive building load optimization method from utility rate structure perspective with renewables and energy storage,” in *2021 International Conference on Smart Energy Systems and Technologies (SEST)*. IEEE, 2021, pp. 1–6.
- [16] —, “A universal optimization framework for commercial building loads using ders from utility tariff perspective with tariff change impacts analysis,” *Energy Reports*, vol. 9, pp. 6088–6101, 2023.

- [17] N. Himabindu, S. Hampannavar, B. Deepa, and M. Swapna, “Analysis of microgrid integrated photovoltaic (pv) powered electric vehicle charging stations (evcs) under different solar irradiation conditions in india: A way towards sustainable development and growth,” *Energy reports*, vol. 7, pp. 8534–8547, 2021.
- [18] S.-G. Yoon and S.-G. Kang, “Economic microgrid planning algorithm with electric vehicle charging demands,” *Energies*, vol. 10, no. 10, p. 1487, 2017.
- [19] A. Purvins, C.-F. Covrig, and G. Lempidis, “Electric vehicle charging system model for accurate electricity system planning,” *IET Generation, Transmission & Distribution*, vol. 12, no. 17, pp. 4053–4059, 2018.
- [20] M. von Bonin, E. Dörre, H. Al-Khzouz, M. Braun, and X. Zhou, “Impact of dynamic electricity tariff and home pv system incentives on electric vehicle charging behavior: Study on potential grid implications and economic effects for households,” *Energies*, vol. 15, no. 3, p. 1079, 2022.

- [21] B. Tan and H. Chen, “Multi-objective energy management of multiple microgrids under random electric vehicle charging,” *Energy*, vol. 208, p. 118360, 2020.
- [22] Y. Huang, H. Masrur, M. S. H. Lipu, H. O. R. Howlader, M. M. Gamil, A. Nakadomari, P. Mandal, and T. Senjyu, “Multi-objective optimization of campus microgrid system considering electric vehicle charging load integrated to power grid,” *Sustainable Cities and Society*, vol. 98, p. 104778, 2023.
- [23] M. Khemir, M. Rojas, R. Popova, T. Feizi, J. F. Heinekamp, and K. Strunz, “Real-world application of sustainable mobility in urban microgrids,” *IEEE Transactions on Industry Applications*, vol. 58, no. 2, pp. 1396–1405, 2022.
- [24] [Online]. Available: <https://openmodelica.org/>
- [25] [Online]. Available: <https://modelica.org/modelicalanguage.html>
- [26] [Online]. Available: <https://openmodelica.org/doc/OpenModelicaUsersGuide/latest/omedit.html>

- [27] [Online]. Available: <https://simulationresearch.lbl.gov/modelica/>
- [28] S. Patel, “Epri head: Duck curve now looks like a canyon,” Apr 2023. [Online]. Available: <https://www.powermag.com/epri-head-duck-curve-now-looks-like-a-canyon/>
- [29] [Online]. Available: <https://www.gov.ca.gov/2020/09/23/governor-newsom-announces-california-will-phase-out-gasoline>
- [30] [Online]. Available: https://afdc.energy.gov/stations/#/analyze?country=US&fuel=ELEC&ev_levels=2®ion=US-CA
- [31] [Online]. Available: <https://www.gov.ca.gov/2023/08/02/milestone-1-in-4-new-cars-sold-in-california-were-zero-emission/>
- [32] [Online]. Available: <https://www.transportation.gov/rural/ev/toolkit/ev-basics/charging-speeds>

- [33] D. T. Ton and M. A. Smith, “The us department of energy’s microgrid initiative,” *The Electricity Journal*, vol. 25, no. 8, pp. 84–94, 2012.
- [34] K. R. Padiyar and A. M. Kulkarni, *Microgrids: Operation and Control*, 2019, pp. 415–453.
- [35] [Online]. Available: <https://numpy.org/>
- [36]

