

Article

Plug-in-Hybrid Vehicle Use, Energy Consumption, and Greenhouse Emissions: An Analysis of Household Vehicle Placements in Northern California

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Abstract: We report on the real-world use over the course of one year of a nickel-metalhydride plug-in hybrid—the Toyota Plug-In HV—by a set of 12 northern California households able to charge at home and work. From vehicle use data, energy and greenhouse-emissions implications are also explored. A total of 1557 trips—most using under 0.5 gallons of gasoline—ranged up to 2.4 hours and 133 miles and averaged 14 minutes and 7 miles. 399 charging events averaged 2.6 hours. The maximum lasted 4.6 hours. Most recharges added less than 1.4 kWh, with a mean charge of 0.92 kWh. The average power drawn was under one-half kilowatt. The greenhouse gas emissions from driving and charging were estimated to be 2.6 metric tons, about half of the emissions expected from a 22.4-mpg vehicle (the MY2009 fleet-wide real-world average). The findings contribute to better understanding of how plug-in hybrids might be used, their potential impact, and how potential benefits and requirements vary for different plug-in-vehicle designs. For example, based on daily driving distances, 20 miles of charge-depleting range would have been fully utilized on 81% of days driven, whereas 40 miles would not have been fully utilized on over half of travel days.

Keywords: plug-in hybrid; electric drive; charging; energy use; greenhouse gas emissions; household driving behavior; real world data; alternative fuel; battery size; fuel consumption

1. Introduction

The world's major automakers are developing plug-in vehicles as part of their strategy to address efficiency, air-pollution, energy-security, greenhouse-gas, and other concerns held by regulators and consumers. Production of early offerings is already slated to be in the tens of thousands of vehicles in 2011, and, with several additional manufacturers planning to introduce models in 2012 and 2013, could exceed 100,000 soon. However, the assortment and degree of benefits realized by plug-ins, as well as the challenges their commercialization poses, depend on a number of factors. These include: vehicle design [1], adoption, and use, as well as recharging behavior and the nature and extent of available infrastructure. Analysis of data from real-world use of plug-in vehicles can contribute to a better understanding of their anticipated use and impact, and of how these vehicles might best be designed, charged, and otherwise prepared for by policymakers and strategic planners. Nevertheless, such data are still relatively scarce and usually based on the use of aftermarket conversions [2]. This study examines the real-world use over the course of a year of an early-generation, nickel-metalhydride (NiMH) plug-in-hybrid vehicle-the Toyota Plug-In HV-by a series of 12 California households able to charge both at home and work (but not elsewhere). It analyzes driving and charging behavior and calculates measures of energy consumption and greenhouse gas (GHG) emissions associated with the observed vehicle use.

Early experimental development of plug-in hybrids focused largely on vehicles with 50–150 miles (mi) of all-electric-range (AER) capability [3] and subsequent early theoretical analysis on designs with 20–60 AER [4]. More recently, analysis has suggested the early stages of plug-in-hybrid evolution efforts should focus on vehicles with an AER of 10 to 20 mi rather than 30 to 40 mi [5]. Like Williams and Lipman [6], this study focuses on plug-in hybrids with smaller batteries providing shorter charge-depleting (CD) ranges and operating in blended mode. Such vehicles promise to more economically provide fuel economy improvements (currently a more familiar metric to consumers than all-electric range) [7] and to require less powerful and capacious electric components [8] and less-costly-to-buy-and-operate recharging infrastructure. Axsen *et al.* [9] found, given a hypothetical choice, potential early adopters of plug-in hybrids in California opted for vehicle designs with the lowest CD range. In their exercise, the base CD range offered was 10 miles, with an option to purchase 20 miles for an additional \$2,000 or 40 miles of electric range for \$4,000. For these reasons smaller-battery, blended-mode plug-in hybrids may be more easily and widely commercialized and supported, particularly in the near-to-mid term.

The design of the vehicle driven for the study presented here is at the low end on the spectrum of battery size and CD range (see Section 2.1). Indeed, it should be noted that the most current Toyota Plug-In HV, a plug-in version of the Prius utilizing 5.2 kilowatt-hours (kWh) of lithium-ion (Li-ion) batteries, is purported to roughly double the nominal miles of CD range [10]. Uniquely, then, this study explores this less-charted end of the analysis spectrum. In doing so, it also creates a perspective on the starting point of an innovation trajectory that builds up to plug-in vehicles from what exists commercially today (the successful Toyota Prius), concordant with the way successful innovations tend to build on continuous origins [11,12].

The data for this analysis were collected as part of an interdisciplinary research collaboration, the California Clean Mobility Partnership (CCMP). The CCMP was funded through California Assembly

Bill 1811's incentive program for alternative fuels, managed by the California Air Resources Board (CARB) and the California Energy Commission (CEC), along with cost share from Toyota Motor Engineering & Manufacturing North America, Inc. (TEMA) and Toyota Motor Sales' Advanced Technology Group (TMS). The overall research team included the University of California (Berkeley and Irvine), CARB, TEMA, and TMS.

Households selected for the project participated for three months, consecutively driving a hybrid (Toyota Prius), a plug-in hybrid (Toyota Plug-In HV), and then a fuel-cell SUV (Toyota FCHV-adv) for four weeks per vehicle. In addition to the vehicle operation data described in this study, data were collected from focus groups, surveys, interviews, GPS systems, and user logs to inform other attitudinal, behavioral, technical, economic, and environmental/energy assessments, as well as policy and educational message development.

2. Methodology

2.1. Vehicle

This study analyzes a dataset provided by Toyota to UC Berkeley's Transportation Sustainability Research Center (TSRC) based on information collected from the vehicle CAN-Bus of the Toyota Plug-In HV used in the CCMP. The Toyota Plug-In HV is different from a Prius because it adds charging capability and a second nickel-metal-hydride (NiMH) battery for increased electric drive and a total of 2.6 kWh of storage [13], as described in Table 1. The vehicle was one of the first manufacturer-provided plug-in hybrids available for study. Unlike third-party conversions, which had limited access to proprietary vehicle control systems and thus altered driving behavior, this vehicle was able to drive more often using battery power, as evidenced by fewer engine starts and overall higher all-electric speed capability.

	Toyota Plug-In HV Used in CCMP Study	Tovota Prius Hybrid
Mass	1360 kg	1260 kg
EV drive range	Nominally ~6-mi, full charge [16]	Brief periods at low speeds
EV mode max. speed	~62 mi/h	~20 mi/h under light throttle
Propulsion battery	$6.5 \text{ Ah} \times 2 = 13 \text{ Ah} (2.6 \text{ kWh}) \text{ NiMH}$	6.5 Ah
Peak power capacity	100 kW	81 kW
Charging time	~3–4 h (110 V), ~1–1.5h (220 V)	n/a

Table 1. Differences between the Toyota Plug-In HV and Toyota Prius (adapted from [14,15]).

2.2. Household Placements

Households selected for the project participated for three months, consecutively driving a hybrid (Toyota Prius), a plug-in hybrid (Toyota Plug-In HV), and then a fuel-cell SUV (Toyota FCHV-adv) for four weeks per vehicle. Household selection was constrained by a number of practical factors. Access to hydrogen fueling was a primary constraint for placement. It was determined that households would fuel at the California Fuel Cell Partnership (CaFCP) in West Sacramento. Centralized recruitment through an employer or building corporation was chosen to facilitate recruitment and the provision of workplace vehicle charging for the plug-in vehicles.

In addition to proximity to the CaFCP, candidate organizations were required to:

- have secure parking for the study vehicles;
- be willing to install a 120-volt (V), outlet with a 15-ampere (A) breaker in a shaded location for charging of the plug-in when parked at the work location; and
- have management that was receptive to the study and willing to send study recruitment material to their employees.

After interviewing potential study host organizations, Raley's Family of Fine Stores corporate headquarters in West Sacramento met all of the requirements and management was enthusiastic about the project. About 500 employees received the recruitment email inviting them to participate in the study.

Driver selection included screening the drivers for a number of attributes, including:

- a good driving record;
- a 120-V outlet with a 15-A breaker for home charging;
- secure, outdoor but off-street parking and a round-trip commute distance of 50 miles or less for the Toyota FCHV-adv;
- successful completion of a driving evaluation;
- understanding of the responsibilities and requirements for driving non-commercially available vehicles; and
- agreement to participate in all of the data collection aspects of the research—including the surveys, exit interview, drive log, and providing gas receipts and electricity bills.

One additional household member was allowed to drive the study vehicles and participate in the study in addition to the primary driver recruited through the company participant. There were a total of 18 drivers.

The sample of drivers is small from a statistical perspective, and was drawn from employees of a corporate headquarters. When compared to the population of California 18 years or older, as characterized by the 2006–2008 American Community Survey [17], the sample differs in some notable ways. Table 2 compares the distribution of gender, age, income, and education. As a group, the sample reflects upper-income, middle-class, working Americans. About 60% of the sample was female in comparison to the population's even split. Study participants were mostly of working age. The sample did not contain any college-age participants or participants over the age of 64. The distribution of respondent education is skewed slightly toward higher education levels. Finally, the household income of respondents was on balance far higher than the general population: 84% of households made more than \$75,000 a year. Thus, the sample appears to have the means and several other characteristics that might make it more suitable for early plug-in-vehicle market participation than the California population as a whole.

2.3. Dataset

The dataset analyzed here characterizes each of 2113 logged driving (1676) or charging (437) events in northern California from May 2009 into May 2010. Variables used include: start date, start time, duration (s), distance traveled (mi), gasoline used (gal), and battery energy used (kWh), from

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which several other quantities are calculated and modeled. Two segments of data—6/24/09 thru 07/03/09 and 01/24/10 thru 02/04/10—were found to be unintentionally overwritten and are missing from this analysis.

Demographic Attribute	Sample	California Population
Gender	N = 18	N = 27,043,417
Male	38.9%	49.6%
Female	61.1%	50.4%
Age Category	N = 18	N = 27,043,417
18–24	0%	14%
25–34	13%	19%
35–44	25%	20%
45–54	50%	19%
55–64	13%	13%
65–74	0%	8%
75 or over	0%	7%
Total	100%	100%
Education	N = 18	N = 27,043,417
Did not complete high school	6%	20%
High school graduate	11%	24%
Some college	28%	23%
2-year college degree	11%	7%
4-year college Degree	33%	17%
Graduate Degree	11%	9%
Other	0%	0%
Total	100%	100%
Income (Households, \$ US)	N = 12	N = 12,177,852
Less than \$10,000	0%	5%
\$10,000 to \$25,000	0%	14%
\$25,000 to \$35,000	0%	9%
\$35,000 to \$50,000	8%	13%
\$50,000 to \$75,000	8%	18%
\$75,000 to \$100,000	25%	13%
\$100,000 to \$150,000	42%	15%
More than \$150,000	17%	13%
Total	100%	100%

Table 2. Demographics of study drivers and the California population*.

* California population estimates are from the U.S. Census Bureau's 2006–2008 American Community Survey [17].

2.4. Energy Demand Profiles

Electricity and gasoline demand profiles are constructed for each day of the week by summing calculated average power entries in one-minute blocks. Average power is calculated by dividing the actual energy used (kWh of either gasoline or electricity) over the entire event (driving or charging episode) by the duration of the event (in h). This implicitly makes the simplifying assumption that

charging or gasoline consumption occurred at a constant, average rate throughout a given event [18]. Gasoline usage is computed relatively directly, whereas the battery-energy-used data is adjusted in sign and multiplied by a factor (1/0.83) to reflect an assumed constant charger efficiency of 83%, roughly similar to Lemoine *et al.* [19].

2.5. Greenhouse-Gas Estimation

Emissions from gasoline demand are computed following Axsen *et al.*'s [9] 2010 use of 86 grams of fuel-cycle carbon-dioxide-equivalent (gCO₂e) greenhouse gases (GHGs) assigned to each megajoule (MJ) of gasoline [20]—67 grams (g) for fuel combustion [21] and 19 g for upstream emissions [22].

The consumer electricity demand profile described in Section 2.4 is increased by an additional 7% to account for transmission and distribution losses (a common rule-of-thumb). Thus, every kWh of electricity consumed in vehicle operation is assumed to require $1.29 \ (=1.07/0.83) \ kWh$ of electricity generation. California power-plant emission factors are then assigned to compute emissions from electricity demand. This is done using three methods reflective of 2010 California emissions: (1) using an average of total state emissions (403 gCO₂e/kWh) [9], (2) using a 2010-average of marginal state emissions (626 gCO₂e/kWh) [23,24], and (3) using a matrix of marginal 2010 rates that vary by hour of day and month [24] to match with charging times. The marginal rates, both that averaged over the year into a single value and those in matrix form by day and month, are as modeled by EDGE-CA, a merit-order dispatch model of generation on the California grid in 2010 that includes firm and system imports of power from neighboring states [24].

3. Results and Discussion

3.1. Vehicle Use

3.1.1. Driving Behavior

Table 3 summarizes the driving data for the set of 1557 trips, after excluding 119 zero-distance, presumably "key-on only" events from a total of 1676 events. Trips ranged up to 2.4 hours (h) and 133 miles (mi), but on average were a dozen minutes long and covered about 7 mi.

N = 1557	Start Date	Duration (h)	Distance (mi)
Total		362	11,309
Min.	5/5/09	0.001	0.00002
Mean		0.2	7.3
Max.	5/3/10	2.4	133

 Table 3. Driving behavior summary.

3.1.1.1. Daily Driving and Battery Size

Table 4 and Figure 1 describe total daily driving distance and its distribution by the day of the week and distance. The information on the driving patterns of the study sample contained in Figure 1 is further detailed in Table A-1 (in the appendix). Figure 1 also includes labels for three distances consistent with CD ranges of interest: 10 mi (90% of all driving days exceeded this distance), 20 mi

(81%), and 40 mi (47%). In addition to excluding zero-distance or "invalid" driving events—as in Tables 3.1-1 and A-1—Table 4 and Figure 1 exclude zero-travel days. In other words, they examine only those days on which the vehicle was driven. More distance was covered on weekdays, generally over 30 mi/day and averaging 35 mi/day, as compared to weekends, which averaged 21 mi/day. However, some of the longest-distance days were observed on the weekends.

Miles	Sunday	Monday	Tuesday	Wednesday	Thursday	Friday	Saturday	Weekday	All
0	100%	100%	100%	100%	100%	100%	100%	100%	100%
1	76%	98%	100%	96%	98%	100%	90%	98%	95%
10	61%	89%	100%	96%	98%	100%	73%	96%	90%
20	42%	86%	95%	91%	85%	98%	53%	91%	81%
30	30%	68%	84%	80%	70%	80%	47%	77%	68%
40	24%	48%	50%	51%	53%	56%	37%	51%	47%
50	24%	23%	25%	31%	20%	29%	30%	26%	26%
60	21%	2%	18%	16%	15%	17%	23%	14%	16%
70	15%	2%	14%	9%	10%	10%	17%	9%	10%
80	15%	0%	9%	7%	8%	2%	17%	5%	8%
90	9%	0%	7%	4%	0%	2%	17%	3%	5%
100	9%	0%	5%	4%	0%	2%	13%	2%	4%
125	3%	0%	2%	0%	0%	2%	7%	1%	2%
150	0%	0%	0%	0%	0%	2%	7%	~0%	1%
180	0%	0%	0%	0%	0%	0%	0%	0%	0%

Table 4. Percentage of days exceeding a given daily driving distance (% of days, *travel days only*).

It is important to note that our sample of drivers is not necessarily representative of the general population (though they may be more representative of early adopters, as described in Section 2.2). For example, they were screened for having one-way commutes less than 50 miles, to be sufficiently close to hydrogen refueling for their third vehicle placement. Keeping this in mind, and in order to compare these study observations with the driving behavior of the general population, Figure 1 also illustrates a similar distribution of daily driving distances derived from the 2009 National Household Travel Survey (NHTS) [25]. The NHTS is a large, nationwide travel survey that collects a single day of travel data from each respondent, including total miles driven. Hence, it does not characterize the longitudinal profile of national driving, but rather a large cross-section (N = 181,051) of people who drove on the day that they were sampled. The NHTS profile presented here consists only of the distance driven during the day that they were sampled. Thus it does not include zero-distance or non-"car" travel days. (However, each observation has been rebalanced using the trip weights provided with the NHTS dataset.)



Figure 1. Percentage of days exceeding a given total driving distance (*travel days only*).

As illustrated in Figure 1, about 72% of all respondents sampled in the 2009 NHTS exceeded 10 miles on the day they were sampled and 50% exceeded 20 miles. It should be noted that long-distance trips can diminish the advantages of plug-ins, emphasizing the importance of those trips. However, compared to the NHTS, the study sample had a significantly larger percentage of days exceeding nearly all distances up to about 60 miles, and only a somewhat lower percentage of days exceeding distances greater than 60 miles. Thus, they had daily driving requirements that would have exhausted CD ranges of particular interest (e.g., 10–50 miles) more frequently.

For vehicle designers, Table A-1 and Figure 1 also give some insight as to how fully utilized the battery might be. For example, based on the sample, to assure that the expensive battery asset is fully utilized on at least 81% of the days it was driven by the study participants, the battery should be designed to provide no more than 20 miles of CD range. Further, this is roughly twice the distance required for similarly full utilization by the larger NHTS sample. Similarly, based on the study sample, on about half of the days driven, a 40-mi CD range would not be fully utilized.

3.1.2. Charging Behavior

Table 5 and Figure A-2 summarize the charging data for the set of 399 charging events. This excludes 38 non-charging events from a total of 437 events—presumably attempts where the vehicle went into charging mode but the battery did not experience a net charge (e.g., the charging cord was plugged into car but not the wall). Charging events lasted as long as 4.6 hours, but, on average, were a little over two-and-one-half hours [26].

N = 399	Start Date	Duration (h)
Total		1036
Min.	5/5/09	0.005
Mean		2.6
Max.	5/3/10	4.6

Table 5. Charging behavior summary.

Table 6 and Figure 2 describe the percentage of the number of charging events and their distribution by the day of the week and time. The percentage of charging events is found by dividing the count of charging events that occurred during the specified minute on a given day of the week by the total number of charging events for that day of the week. On weekdays, the largest overall mass or "mountain" of charging events occurred between 6pm and 3am, peaking around roughly 7pm to 11pm. The second-biggest mass of charging events, presumably highly influenced by the availability of workplace charging, happened between 6am and noon, peaking between roughly 8am to 10am. A third, "after lunch" peak, occurred between roughly 1 or 2pm and 5pm. Compared to the EPRI/NRDC charging profile that assumes three-quarters of charging occurs nominally off-peak (10pm to 6am) [27], this profile (unconstrained by peak pricing) exhibits much of its charging in the early evening before 10pm and an earlier, bigger, and partially bimodal (before and after lunch) daytime peak.





	Sunday	Monday	Tuesday	Wednesday	Thursday	Friday	Saturday	Weekday	All
Ave.	12.0%	10.7%	11.7%	9.6%	10.4%	11.2%	11.0%	10.7%	10.9%

Table 6. Percentage of charging events (%).

Weekend charging days differ from weekday charging trends and from each other. For example, the daytime charging peak starts later, as might be expected. In round numbers, on Saturdays a "single" daytime peak spans roughly 9am to 5pm and peaks around 11am to 1pm; on Sunday it largely starts after noon, peaks after 2pm, and spans into the evening charging peak, which, as with weekdays, starts taking effect around 6pm. Saturday evening charging is more spread out and dips to a local minimum between 9pm and 11pm.

3.2. Energy Use

3.2.1. Driving Energy Use

Table 7 summarizes driving energy for the set of 1557 trips. Most events used less than one-half gallon of gasoline. Average power (kW of gasoline demanded) is calculated as described in Section 2.4 and used in subsequent calculation of GHG distributions from driving (see Section 3.3.1).

N = 1557	Gasoline Used (gal)	Ave. Gasoline Demand (kW of Gasoline)
Total	225	
Min.	0	0
Mean	0.1	15
Max.	2.7	57

 Table 7. Driving energy summary.

Dividing total gasoline used by total distance traveled, the average fuel consumption for this specific set of vehicle observations is 0.66 kWh gas/mi. This ignores the electrical charging energy used, and including that contribution (see below), the overall average energy use is roughly 0.70 kWh/mi.

3.2.1.1. Fuel Economy by Driving Distance

Figure 3 depicts gasoline fuel economy by trip distance. Part (a) shows all trips that used gasoline. Part (b) is a magnification along both axes of (a). It shows that the most extreme variability and influence of plugging in is largely gone for trips longer than roughly 10 miles (e.g., trip-to-trip differences greater than 75 mi/gal fall to the more modest, though still considerable variation seen in hybrids and as a function of varying driving conditions). Part (c) includes fully electric *trips* and explores their distribution by magnifying the short trip distances. It depicts 236 fully electric trips. Unlike aftermarket conversions, all-electric operation of the study vehicle lasted for the entire multiple-mile trip in several cases without the vehicle engine turning on (e.g., if triggered when the all-electric power or energy-storage capabilities had been exceeded, or possibly for other reasons unknown to the authors). The longest observed entirely electric trip [28] was about 5.2 miles.

However, most (73%) of the entirely electric trips observed were less than one quarter of a mile in length, as seen in Figure 4. This is expected because the vehicle was not designed to maximize provision of fully electric *trips* or even of all-electric *range*, but rather uses computer optimization to manage electric operation within the context of its charge-depleting, blended-mode operation. Additionally, it should be noted that the Raley's headquarters building is located next to a highway, and the return commute of drivers may have included routine hard accelerations shortly after starting.

Figure 3. Gasoline fuel economy by trip distance: (a) for trips that used gasoline; (b) magnification; (c) detail including fully electric trips (note: electric trips have undefined mi/gal).



3.2.2. Charging Energy Use and Comparison

Table 8 and Figure A-3 summarize the charging energy use for the set of 399 charging events. "Battery energy used" is defined as negative for charging events. The largest recharge observed added 1.67 kWh to the battery, 64% of a 2.6-kWh battery pack. Most of the recharges observed, however, added less than 1.4 kWh, and the mean charge 0.92 kWh, or about 35% of a 2.6-kWh pack. Though no data is available describing the instantaneous charging power, the average power drawn from the 120-V/15-A circuits the vehicle was allowed to plug into was less than one-half of one kilowatt. This assumes an 83% charging efficiency, and is calculated by dividing the energy used during a given event by the duration of that event as described in Section 2.4. This is quite modest relative to the requirements facing utilities should battery EVs and/or fast charging become prevalent.

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N = 399	Battery Energy Used (kWh)	Ave. Power (kW)
Total	-367	
Min.	-1.7	0.003
Mean	-0.9	0.4
Max.	-0.0004	0.8

 Table 8. Charging energy summary.



Figure 4. All-electric trips exceeding a given trip distance (%).

Table 9 estimates the total charging energy demanded over the course of the study (minus lost data) and its distribution by the day of the week. Despite a slightly lesser percentage of charging events on weekdays (Table 6), substantially more total charging was done on weekdays, as might be expected with availability of workplace charging.

Table 9. Total charging energy demanded * by day (kWh).

	Sunday	Monday	Tuesday	Wednesday	Thursday	Friday	Saturday	Weekday	Weekend	All
Total	39	72	80	76	73	69	31	371	70	441

* Note: includes all available data from one vehicle over 12 months; charging energy = –(battery energy used)/(charging efficiency), *i.e.*, $441 = -(-367) \times 0.83$, with rounding errors.

3.3. Greenhouse Gas (GHG) Emissions

3.3.1. Driving GHG Emissions

Figure 5 shows the distribution of total GHG emissions from gasoline consumption by the time of day and day of the week. Although the temporal distribution of greenhouse gases, which have more of a global impact, is less important than that of criteria air pollutants, which act more locally, these temporal characterizations are also included to provide additional illustration of the overall driving impact. As noted in the methodology discussion, 86 grams (g) of fuel-cycle carbon-dioxide-equivalent (gCO2e) GHGs are assigned to each megajoule (MJ) of total gasoline demand [20]—67 g for fuel combustion [21] and 19 g for upstream emissions [22].



Figure 5. Total driving GHG emissions by time and day of week: (a) weekdays; (b) weekends.

3.3.2. Charging GHG Emissions and Comparisons

Figure 6 compares charging emissions to driving emissions by time of day over one selected weekday (Wednesdays). Charging emissions are assigned 626 gCO₂e/kWhe [24], representative of 2010 California marginal power-plant emissions as described in the methodology section. Note that this is very similar to the rate assigned to a new 2010 simple-cycle gas turbine by EPRI/NRDC, 628 gCO₂e/kWhe- [27]. For comparison, Shiau *et al.* [29] use 690 g/kWh as a U.S. average (and 9%, rather than 7%, transmission loses).

Table 10 compares GHG emissions from charging calculated from the electricity demand observations using three methods: one "average" and two "marginal" methods. It also summarizes overall GHG findings.



Figure 6. Total GHG emissions by time of day: charging and driving.

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Table	10.	(iH(i	emissions	summary
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MgCO ₂ e	Based on Observations of:	Assumptions
2.258	Gasoline demand	86 g/MJ gasoline (fuel-cycle) [20]
0.190	Electricity demand	403 g/kWh electricity ("2010 average") [9]
0.296	Electricity demand	626 g/kWh electricity ("2010 marginal") [24]
0.309	Electricity demand	2010 marginal rates as a function of month
		and hour [24]
2.554	Gasoline & electricity demand	86 g/MJ gasoline, 626 g/kWh electricity
5.2	Driving distances	22.4 mpg "real-world" MY2009 fleet-wide
		economy [30]

Table 10 indicates that study participants produced roughly 2.6 metric tons of GHGs over the course of their 11,309 miles of driving, or roughly 226 g/mi, including emissions estimated from use of both gasoline and 2010 marginal California electricity. Note that 226 g/mi is roughly equivalent to the rate estimated by EPRI/NRDC for plug-in hybrids with 20-mile all-electric-range (PHEV20s) being charged by 2010 new gas turbines, as depicted in Figure 5-1 of their 2007 analysis [27]. Although PHEV20s were characterized as achieving 37.9 mpg in charge sustaining mode (*i.e.*, when the all-electric range was depleted) and thus might be considered slightly larger or less efficient than the Prius platform [31], in previous related studies, even compact PHEV20s are estimated to require batteries greater than 5 kWh in capacity [4]. Similarly, Shiau *et al.*'s "minimum cost" all-electric plug-in hybrid was found to be a PHEV20 with a 5.4 kWh battery, and emitting 7.92 kg/day × 300 days = 2.38 metric tons per year [29].

Table 10 also indicates that had study participants instead achieved the U.S. EPA's "real-world" fleet-wide average fuel economy for model-year-2009 vehicles over the distance driven during the study, they would have produced roughly twice as much GHG. It is important to note that this potential difference results from several compounded factors, including not just the incremental improvements

of the plug-in technology but also from the comparison of a specific vehicle type to a sales-weighted representative average of all passenger-vehicle types. An additional desirable comparison would of course be between the study vehicle and a Toyota Prius. However, although the participants were asked to assess a Prius via the survey portion of the larger study, the Prius driven by the study participants could unfortunately not be equipped to provide the same data analyzed here. Further, precision limitations in the comparison described above of the plug-in vehicle's observed demand with estimates based on study distances and average fuel economies grow more acute as the comparison gets tighter and unfortunately do not allow meaningful comparison with an "average" Prius.

4. Summary & Conclusions

4.1. Study Context

Analysis of data from real-world use of plug-in vehicles—still relatively rare due to limited vehicle availability and nascent vehicle and infrastructure design—can contribute to a better understanding of their anticipated use and impact. This study examines the real-world use over 12 months of an early-generation, nickel-metal-hydride plug-in-hybrid vehicle by a series of 12 California households able to charge at home and work.

Plug-in hybrids with smaller batteries providing shorter charge-depleting (CD) ranges and operating in blended mode may be more easily and widely commercialized and supported, particularly in the near-to-mid term (see Section 1). The vehicle driven for the study was one of the first manufacturer-provided plug-in hybrids available for study and is at the low end on the spectrum of battery size and CD range—lower than the Prius Plug-in Hybrid Vehicle (Prius PHV) using lithium-ion batteries announced for availability in early 2012 [32]—creating a perspective on the starting point of an innovation trajectory that builds up to plug-in vehicles from what exists commercially, concordant with the way successful innovations tend to build on continuous origins [11,12].

Determination of household placement location was constrained by a number of practical factors. Access to hydrogen fueling for a vehicle not analyzed here but part of the overall CCMP study, the Toyota FCHV-adv, was a key constraint for placement selection.

4.2. Driving & Charging Behavior

The dataset analyzed here includes 2113 logged events (1676 driving and 437 charging events) in northern California from May 2009 into May 2010. There were 1557 trips covering 11,309 miles, excluding 119 zero-distance driving events. Trips ranged up to 2.4 hours and 133 miles long, but averaged 14 minutes and 7 miles. More total distance was covered on weekdays, generally over 30 mi/day and averaging 35 mi/day as compared to weekends, which averaged 21 mi/day. However, some of the longest-distance days were observed on the weekends.

The findings suggest that for the expensive battery asset to be fully utilized on at least 81% of the days driven by the study participants—who had a higher percentage of travel days exceeding distances comparable to charge-depleting ranges of interest (10–50 miles) than the NHTS drivers illustrated in Figure 1—the battery should be designed to provide no more than 20 miles of CD range. In contrast, on about half of the days driven, a 40-mi CD range would not be fully utilized. This is of course a very

different optimization (maximizing utilization and minimizing size for affordability) than for an all-battery EV: if able to provide a full 100 miles of range (at several times the battery cost) EVs face the challenging prospect of not providing enough to fully cover all of the driving logged for our study participants—let alone their perceived range needs or desires—with accordant marketing and product re-definition challenges. This is not to say that those challenges are insurmountable or that one product definition or multifaceted business model is superior to another, but rather to simply highlight the distinctions between plug-in hybrids and battery EVs in this regard.

Charging events lasted as long as 4.6 hours, but, on average, were a little over two-and-one-half hours. In terms of the diurnal distribution of charging events, the biggest "mountain" of weekday charging events occurred between 6pm and 3am, peaking between roughly 7pm to 11pm. The second-biggest mass of charging events, presumably highly influenced by the availability of workplace charging, happened between 6am and noon, peaking between roughly 8am to 10am. A third peak occurred roughly between 1pm and 5pm.

4.3. Energy Use

Most trips used less than one-half gallon of gasoline. The mean gasoline consumption was 0.1 gallons (gal) per trip, whereas the maximum was 2.7 gal, and the total amount of fuel consumed was 225 gal. Dividing total gasoline used by total distance traveled, the average fuel consumption for this particular set of vehicle observations is 0.66 kWh of gasoline per mi. Including total charging energy (*i.e.*, total battery energy divided by 0.83 to account for charging losses), the overall average is 0.70 kWh/mi. This implies that electricity consumption accounted for roughly 6% of the total energy used (gasoline plus electricity).

The extreme variability and influence of plugging in on fuel economy largely disappears for trips longer than roughly 10 miles (though the considerable variability seen for charge-sustaining hybrids of course remains). Unlike aftermarket conversions, all-electric operation lasted for the entire multiple-mile trip in several cases without the vehicle engine turning on. Nevertheless most (73%) of the entirely electric trips observed were less than one quarter of a mile in length. This is expected, because the vehicle was not designed to maximize the provision of fully electric *trips* or even of all-electric *range*, but rather uses computer optimization to manage electric operation within the context of its charge-depleting, blended-mode operation. Further, hard accelerations may have been required at the beginning of many trips.

The largest observed charging event added 1.67 kWh to the battery, 64% of the 2.6-kWh battery pack. Most of the charging events observed, however, added less than 1.4 kWh, and the mean charge 0.92 kWh, or about 35% of a 2.6-kWh pack. Though no data is available describing the instantaneous charging power, the mean average power drawn (as described in Section 3.2.2) was estimated to be less than one-half of one kilowatt—quite modest relative to the requirements facing utilities should battery EVs and/or fast charging become prevalent. Despite a slightly lower percentage of charging events, substantially more total charging was done on weekdays, as might be expected with the availability of workplace charging.

4.4. Greenhouse Gas (GHG) Emissions

Emissions from charging were estimated to be a small fraction (12%) of emissions from driving this study vehicle, as seen in Figure 6. Over time, however, the proportion of charging emissions will increase with the increased utilization of electric drive. Further, when assigning emissions to vehicle charging, policymakers face a difficult choice. For example, they can choose to assign rates reflective either of total power-plant operation averaged over the year or of marginal additions to the grid

either of total power-plant operation averaged over the year or of marginal additions to the grid (emissions from the last power-plant(s) added to serve additional load). Charging load can currently be thought of as a marginal load in the sense that it is being added onto an existing electrical grid whose operation was planned for other reasons. Hence, the example in Figure 6 assigns a simplified marginal emissions rate (reflective of the last power-plants added, but assumed constant and averaged over the year). However, as charging becomes part of the planning process, assigning to charging load the full burden of the marginal emission rate is arguably over-burdening one type of load relative to another. Table 10 compares GHG emissions from charging calculated from the electricity demand observations using three methods: one "average" and two "marginal" methods. Emissions averaged approximately 226 g/mi and were, in total, roughly half that of a conventional baseline.

4.5. Key Findings

Key findings from this study of the use of an early-generation, nickel-metal-hydride Toyota Prius Plug-in HV include:

- Study participants had a higher percentage of travel days exceeding key distances (10–50 miles) than the NHTS drivers illustrated in Figure 1.
- Nevertheless, for a plug-in hybrid's expensive battery asset to be fully utilized on at least 81% of the days driven by the study participants, the battery would need to be designed to provide no more than 20 miles of charge-depleting or "electric" range. In contrast, on about half of the days driven, a 40-mile charge-depleting range would not be fully utilized.
- With "unconstrained" [33] at-home and free workplace charging, this study observed earlier evening (6pm to midnight), additional daytime (6am to noon and, to a lesser extent, noon to 6pm), and less nighttime (midnight to 6am) charging than assumed in some studies (e.g., [27]).
- The mean average power drawn for charging, estimated as described in Section 3.2.2, was less than one-half of one kilowatt. The maximum average power drawn was less than one kilowatt.
- The overall average fuel consumption for this particular set of vehicle observations is calculated to be 0.66 kilowatt-hours of gasoline per mile. Including charging, the overall average is estimated to be 0.70 kilowatt-hours per mile.
- The study participants were estimated to produce roughly 226 grams of GHGs per mile, including emissions from both gasoline (88%) and California marginal electricity (12%). Assuming California marginal electricity increases the contribution of charging by 56% relative to assuming California average electricity.

As expected, the real-world use of a small-battery, blended-mode plug-in hybrid produces results distinct from, and with greater variation and complexity than, analysis of all-electric designs characterized with necessarily simplifying assumptions. For example, Shiau *et al.* [29] confine their scope "to the all-electric strategy for simplicity since blended-strategy operation characteristics are sensitive to control parameters," and their analysis reasonably treats battery depth-of-discharge as a simple function of driving distance, all-electric range as a simple function of battery capacity, and charge-depleting efficiency as constant. Real-world fuel economy of course exhibits considerable variability, as seen in Figure 3. In this case, the extreme variability of real-world fuel economy observations—enhanced by plugging in, charging, and then depleting charge via a complex control strategy—gives way to the less extreme but still considerable variability of regular hybrid operation as trips exceed roughly 10 miles.

The small-battery, blended-operation vehicle observed here used a relatively small amount of electricity. Electricity consumption accounted for roughly 6% of the total energy used (gasoline plus electricity) and emissions from charging are estimated to be roughly 12% of emissions estimated for driving the study vehicle. And the low power draw of this type of vehicle, estimated to average less than one kilowatt in this study, is comparable to other household appliances and significantly less than the likely requirements of battery EVs and fast charging. Nevertheless, the vehicle achieved, through a number of mechanisms, significant fuel-economy and GHG-emissions improvements. For example, the study vehicle was estimated to have averaged roughly half the emissions expected from a 2009 fleet-wide average vehicle, or a rate roughly comparable to previous analysis [4,27] of plug-in hybrids charged by similarly carbon-intensive electricity but largely at night and designed for 20 miles of all-electric range from batteries roughly twice the capacity (and thus cost).

4.6. Directions for Future Research

Additional research is needed analyzing driving and recharging patterns and their relationship to different plug-in-vehicle designs. Future analysis of the CCMP and subsequent vehicle placements could dig more deeply into dynamics related to the distance driven between charging and the electric contribution to driving range in small-battery blended-mode plug-in hybrids. It could also include more and different types of data and analysis—e.g., characterizing the use of the other study vehicle types, using attitudinal/behavioral data from surveys and interviews, and identifying trends in use over time to look for "waning novelty" or "increasing familiarity" effects. Further, investigation of additional topics related to plug-in-hybrid use could be informed by subsequent placements with enhanced data collection, such as how engine on/off events relate to criteria-air-pollutant impacts. Collaborations between analysts modeling and those deploying plug-in hybrids could establish particularly fruitful feedback loops to inform both lines of inquiry.

Collectively, this growing body of knowledge will create an increasing understanding of the anticipated use and impact of electric-drive vehicles, and of how these vehicles might best be designed, fueled, and otherwise prepared for by policymakers and strategic planners.

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References and Notes

- 1. Independent of vehicle size, plug-in drivetrain design ranges through three major categories, from small-battery, blended-mode plug-in hybrids based on series-parallel gasoline-combustion hybrids such as the Toyota Prius PHV to range-extender series hybrids such as the Chevy Volt to all-battery electric vehicles (EVs) such as the Nissan LEAF.
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- 33. Participants did have to pay for the additional electricity used at home over the course of their one-month placement, but were not subject to changes in utility rate structures, smart charging algorithms or other policy or technical constraints.

Appendix





	Sunday	Monday	Tuesday	Wednesday	Thursday	Friday	Saturday	Weekday	Weekend	All
Total	1017	1600	2048	1950	1593	1892	1209	9082	2227	11309
Ave.	20	31	39	37	31	36	23	35	21	31
Max.	133	77	133	113	86	177	162	177	162	177
Miles										
0	63%	85%	83%	85%	77%	79%	58%	12%		11%
1	48%	83%	83%	81%	75%	79%	52%	11%		10%
10	38%	75%	83%	81%	75%	79%	42%	11%		10%
20	27%	73%	79%	77%	65%	77%	31%	11%		9%
30	19%	58%	70%	68%	54%	63%	27%	9%		7%
40	15%	40%	42%	43%	40%	44%	21%	6%		5%
50	15%	19%	21%	26%	15%	23%	17%	3%		3%
60	13%	2%	15%	13%	12%	13%	13%	2%		2%
70	10%	2%	11%	8%	8%	8%	10%	1%		1%
80	10%	0%	8%	6%	6%	2%	10%	1%		1%
90	6%	0%	6%	4%	0%	2%	10%	~0%		1%
100	6%	0%	4%	4%	0%	2%	8%	~0%		~0%
125	2%	0%	2%	0%	0%	2%	4%	~0%		~0%
150	0%	0%	0%	0%	0%	2%	4%	~0%		~0%
180	0%	0%	0%	0%	0%	0%	0%	0%		0%

Table A-1. Daily driving distance (mi or % of days, all days).

Figure A-2. Charging duration.



Figure A-3b is colored blue to highlight that average power is calculated by dividing the energy used during a given event by the duration of that event, as described in Section 2.4.



Figure A-3. Charging (a) battery energy used and (b) average power.

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