# Simulation and Field-Testing of Hybrid Ultra-Capacitor/Battery Energy Storage Systems for Electric and Hybrid-Electric Transit Vehicles

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Abstract— This paper investigates the use of ultra-capacitors combined with batteries as an improved energy storage system for electric, hybrid electric, and hybrid fuel cell transit vehicles. A demonstrator hybrid electric vehicle with an ultra-capacitor system was constructed and used to validate simulations. Results suggest a significant reduction in peak currents experienced by the battery pack in drive cycles with a high number of starts and stops.

## I. INTRODUCTION

Hybrid Electric Vehicles (HEVs) have already been produced in the form of consumer automobiles and mass transit buses [1]. However, the combination of limited battery technology and high power requirements of HEVs has hindered the success of these vehicles. One way to reduce the demand on HEV batteries is to use ultra-capacitors as load-leveling devices for the batteries [2-4]. The relatively high power density of ultra-capacitors should allow for a significant reduction in the power fluctuations imposed on the batteries in HEVs, thereby reducing peak battery currents and extending battery life. As secondary benefits, ultra-capacitors may improve overall energy storage system efficiency and regenerative braking power levels. This paper describes the results and conclusions of a project in which the use of ultracapacitors in conjunction with batteries as an energy storage system for mass transit vehicles is studied.

# II. METHODS

A bidirectional DC-DC converter, shown in Fig. 1, was constructed to provide the means for energy to be transferred back and forth from ultra-capacitors to the DC bus of the hybrid electric vehicle [5-6]. The inductor is 0.36mH, and is rated at 500A peak. The ferromagnetic core of the inductor consists of 2 sets of Metglas® PowerLite® AMCC-1000 amorphous iron C-cores. Multiple gaps were cut into the Ccores in order to reduce the proximity effect on the winding losses. An ultra-capacitor bank consisting of 4 3F, 180V Econd<sup>TM</sup> ultra-capacitors was constructed and is also shown in Fig. 1. Experimental results revealing a complete discharge and charge of the ultra-capacitor bank are shown in Fig. 2.

The control strategy calculates a current request for the ultracapacitor DC-DC converter as a function of the total current demand on the hybrid energy storage system (ESS), the vehicle speed, and the ultra-capacitor state-of-charge (SOC). Fig. 3 is a schedule of the current contribution from the capacitors as a function of total current demand. In addition, a Heath Hofmann, Amit Batra Department of Electrical Engineering The Pennsylvania State University University Park, PA

small amount of current is commanded based on vehicle speed to prepare the ultra-capacitors to deliver high power during acceleration and accept high power during regenerative braking. The controller targets a capacitor SOC of 20% at 0 mph and 70% at 55 mph by commanding small currents up to 20 Amps. The control strategy was developed concurrently with that of the demonstrator vehicle shown in Figure 4. The vehicle is a range-extending series hybrid with a 144 V nominal battery pack, a 15 kW auxiliary power unit, and an ultra-capacitor energy storage system installed in a small trailer with the goal of reducing average and peak battery currents over a wide variety of driving cycles.



Figure 1. Bidirectional DC-DC converter: converter circuit (top), capacitor bank (middle left), converter (middle right), inductor (bottom)



Figure 2. Ultra-capacitor bank charge/discharge using bi-directional DC-DC





Figure 4. Ford Escort series hybrid conversion with ultra-capacitor energy storage system shown at the PTI Test Track

This vehicle was tested on a Clayton model ASMFS96 dynamometer on three transit driving cycles recommended by the Society of Automotive Engineers (SAE) Standard J2711, the recommended practice for measuring fuel economy and emissions of hybrid electric and conventional heavy-duty vehicles: the Manhattan Cycle, the Orange County (O.C.) Cycle, and the Urban Dynamometer Driving Schedule (UDDS) Cycle.

# III. TESTING

Figs. 5 and 6 show dynamometer test results of the hybrid vehicle performing the Manhattan driving cycle. The Manhattan driving cycle is a series of rapid starts and stops typical of urban transit routes with the bus accelerating to a top speed of approximately 25 mph. Fig. 5 shows hybrid vehicle results without ultra-capacitors activated. It can be seen that battery current typically peaks at 100-150 Amps during hard acceleration. The APU generates 20 to 40 Amps to maintain the battery state of charge. Note that in this test, a problem with the battery SOC meter caused loss of APU operation at about 800 seconds. This is not an issue since the Manhattan Cycle repeats the same velocity trace every 550 seconds and a full trace was complete before the problem occurred. By comparison, Fig. 6 shows the same cycle with ultra-capacitors activated. It can be seen that, under these conditions, the battery current exceeds 100 Amps only twice. The combined current of the APU and ultra-capacitors maintains battery voltage in a very narrow range even though large currents are drawn from the DC bus during hard acceleration. From this data it can be observed that the addition of ultra-capacitors to a hybrid electric vehicle reduced the levels and duration of peak battery loads during both charge and discharge on urban transit routes with heavy transient loads.

Figs. 7 and 8 show results of dynamometer tests of the hybrid vehicle running the Orange County driving cycle. The Orange County driving cycle is a series of starts, short cruise periods, and stops typical of commuter transit routes with the bus accelerating to a top speed of 30 mph. Fig. 7 shows hybrid vehicle results without ultra-capacitors activated. It can be seen that battery current peaks at 100-150 Amps during hard acceleration. By comparison, Fig. 8 shows the same cycle in with ultra-capacitors activated. It can be seen that, under these conditions, the battery current upper limit is 100 Amps. From this data it can be observed that the addition of ultra-capacitors to a hybrid electric vehicle significantly reduces battery peak currents on commuter transit driving cycles with intermittent levels of transient load.

Figs. 9 and 10 show dynamometer tests of the hybrid vehicle performing the UDDS driving cycle. The UDDS driving cycle is a series of accelerations to the speeds of secondary and highway routes with significant periods of cruising typical of arterial transit routes. The driving cycle has a top speed of 56 mph. It can be seen that battery current has periods of 100 Amps during cruising and peaks of 150 Amps during hard acceleration. By comparison, Fig. 10 shows the same cycle with ultra-capacitors activated. During sustained cruising, the capacitors quickly become discharged. Battery currents of 100 Amps are once again experienced. Peak currents during acceleration are somewhat reduced below 150 Amps. This data shows that the addition of ultra-capacitors to a hybrid electric vehicle on a highway route reduced peak currents on initial acceleration but did little to reduce sustained loads during periods of cruising.

Figs. 11 and 12 show data of the hybrid vehicle performing a modified driving cycle that combines the Central Business District Cycle (CBD), Commuter Cycle, and Arterial Cycle at the Pennsylvania Transportation Institute test track facility. The CBD cycle consists of seven short accelerations per mile up to 20 mph. The Commuter Cycle is two accelerations per mile up to 30 mph. The Arterial Cycle is a single acceleration per mile up to 30 mph. Fig. 11 shows a test with one CBD cycle followed by one Commuter and one Arterial cycle without the ultra-capacitors activated. Periods of high acceleration produce peak currents near 150 Amps and periods of cruising produce sustained 100 Amp currents. Fig. 12 shows a test with four CBD cycles followed by one Commuter and one Arterial cycle with ultra-capacitors activated. This cycle is an excellent illustration of the effect that an ultracapacitor system can have on battery currents. Peak currents are greatly reduced during the rapid and shallow accelerations of the Central Business District cycle. The short periods of cruising of the Commuter cycle cause deep discharge of the capacitors and higher battery currents. The Arterial Cycle shows complete discharge of the capacitors during cruising speeds according to the state of charge control strategy. The low capacitor state of charge allows the system to recover significant energy during regenerative braking from higher speeds.



Figure 5. Manhattan Cycle without ultra-capacitors disabled



Figure 8. Orange County Driving Cycle with ultra-capacitors enabled



Figure 9. UDDS Driving Cycle with ultra-capacitors disabled



Figure 10. UDDS Driving Cycle with ultra-capacitors enabled



Figure 11. Combined test track driving cycle with ultra-capacitors disabled



Figure 12. Combined test track driving cycle with ultra-capacitors enabled

## IV. SIMULATION

Data from the chassis dynamometer runs of the 1992 Ford Escort demonstrator vehicle presented in the prequel, as well as experimental data taken from an AVS electric transit bus (without an ultra-capacitor energy storage system) provided by the Chattanooga Area Regional Transit Authority (CARTA), provided information for validation of a US DOE PSAT (PNGV Systems Analysis Toolkit) simulation of electric and hybrid-electric mass transit vehicles with ultra-capacitor energy storage systems.

Fig. 13 presents a comparison of the measured and simulated bus voltage of the CARTA bus during the second quarter of the CARTA drive cycle. The purpose of this simulation was to validate the bus model. Comparison of the experimental data with the PSAT simulation reveals close agreement.



voltage of CARTA electric transit bus during second quarter of CARTA drive cycle

Additional validation was conducted on the ultra-capacitor energy storage system. Prior to simulating the ultra-capacitor system on a vehicle level, a stand-alone version of the ultracapacitor/DC-DC converter model was created for validation purposes. Inputs to the stand-alone model were bus voltage and a desired current output. Outputs from the model were ultracapacitor voltage and actual output current. The inputs were fed into the model directly from experimental data. Fig. 14 presents a comparison of the PSAT simulator to the Orange County driving cycle data presented in Fig. 8. We note that the simulated ultra-capacitor voltage deviates from the experimental value over time. This could be due to a slight DC current error between experiment and simulation, which would cause a gradual discharge of the ultracapacitors.



Figure 14. Validation of PSAT simulation with Orange County Driving Cycle

After validation of the PSAT model was completed, extensive simulations of the J2711 standard driving cycles were conducted on a hybrid electric bus design in order to make general conclusions regarding the benefits of ultra-capacitor storage systems. The details of the hybrid electric bus model, both with and without an ultra-capacitor energy storage system, can be found in Table 1.

A useful indicator when considering battery life is the RMS current density in the battery pack over the driving cycle. The resulting RMS current densities in the battery pack for the Manhattan, Orange County, and UDDS driving cycles are provided in Table 2. Figs. 15-17 present histograms of the battery current for each driving cycle, with the data displayed in such a way as to emphasize the percentages at high current levels. The results of the simulations show a significant reduction in peak currents experienced by the battery pack in drive cycles with a high number of starts and stops such as the Manhattan drive cycle, as is shown in the battery current histogram of the hybrid electric bus in Figure 15. The addition of an ultra-capacitor energy storage system to hybrid electric buses is therefore shown to provide both a significant reduction in peak and RMS currents experienced by the battery pack and the ability to reduce the required size of the battery pack if energy storage considerations are not paramount. Similar significant reductions in battery pack currents were obtained for simulations of the intermediate Orange County driving cycle, as shown in Fig. 15. The benefits of the ultra-capacitor system on this Commuter cycle are still apparent but to a lesser degree than the urban Manhattan cycle. Simulations of the UDDS cycle, however, show little benefit and actually some detriment from the ultracapacitor system due to the combination of long periods of acceleration and high speed cruising.

Oltra-capacitor Energy Storage System.			
		<b>HEV</b> Bus Configuration	
	<u> </u>	no caps	w/caps
Vehicle	Vehicle Mass [kg]	16360	16360
	Coefficient of Drag, Cd	0.79	0.79
	Frontal Area [m <sup>2</sup> ]	7.24	7.24
	Motor Peak Power [kW]	190	190
	Engine Peak Power [kW]	170	170
	Generator Peak Power [kW]	120	120
	Mechanical Accessory Load [kW]	5	5
	Electrical Accessory Load [kW]	1.5	1.5
Batt- eries	Nominal Battery Pack Voltage [V]	552	552
	Battery Capacity [A-h]	85	59
	Battery Pack Mass [kg]	1545	1075
Ultracapacitors/DC-DC Converter	Individual Ultracap. Max Voltage [V]	,	300
	Individual Ultracap. Capacitance [F]		2.0
	Individual Ultracap. ESR (Ω)	-	1.5
	# Ultracaps in Series	-	2
	# Ultracaps Strings in Parallel	-	6
	Ultracap. Bank Max Voltage [V]	,	600
	Ultracap. Bank Equivalent Cap. [F]	-	6
	Ultracap. Bank Equivalent ESR (Ω)	-	0.5
	Ultracap. Bank Mass [kg]	_	420
	DC/DC Converter Mass [kg]	-	50

Table 1. Details of PSAT Hybrid Electric Bus Model, With and Without Ultra-capacitor Energy Storage System.

Table 2: RMS Current Density in HEV Bus Battery Pack

	Without Ultra-	With Ultra-
	capacitors	capacitors
Manhattan Cycle	46.9 mA/kg	37.8 mA/kg
O.C. Cycle	56.2 mA/kg	49.1 mA/kg
UDDS Cycle	60.5 mA/kg	64.7 mA/kg

PSAT simulations of the Manhattan, Orange County, and UDDS driving cycles were also performed on the CARTA AVS electric bus model and a modified model which includes an ultra-capacitor energy storage system. The two configurations are provided in Table 3. For the model with the ultra-capacitor energy storage system, a portion of the battery pack of the AVS bus was removed equal to the mass of the ultracapacitor energy storage system to keep the total mass of the bus the same. As the battery pack voltage of the AVS bus is much higher than the hybridized Ford Escort, Econd® ultra-capacitors with a maximum voltage rating of 300V were used.



Figure 15. Battery Current Histograms of HEV Bus Model with and without Ultra-capacitor Energy Storage System, Manhattan Drive Cycle. Data is displayed to emphasize percentages at high current levels.



Figure 16. Battery Current Histograms of HEV Bus Model with and without Ultra-capacitor Energy Storage System, Orange County Drive Cycle. Data is displayed to emphasize percentages at high current levels.

Histograms of the battery current levels in the two electric bus configurations for the Manhattan and Orange County driving cycles are shown in Figs. 18 and 19. The results show a significant reduction in peak battery currents and battery pack voltage swings in the Manhattan cycle, with the effect lessening in the Orange County cycle. In all cycles, the ultracapacitor system absorbs essentially all regenerative braking currents. The RMS current in the battery pack of the EV bus models with and without ultracapacitors is shown in Table 4. Because the battery packs of the bus models with and without ultracapacitors have different capacities, the RMS current per unit mass of the two packs is presented in Table 5 to allow direct comparison.



Figure 17. Battery Current Histograms of HEV Bus Model with and without Ultra-capacitor Energy Storage System, UDDS Drive Cycle. Data is displayed to emphasize percentages at high current levels.

		AVS 22' EV Bus Configuration	
Ĺ		no caps	w/caps
	Vehicle Mass [kg]	10000	10000
<u>e</u>	Coefficient of Drag, C4	0.6	0.6
Ťą.	Frontal Area [m <sup>2</sup> ]	6.7	6.7
>	Motor Peak Power [kW]	150	150
	Electrical Accessory Load [kW]	6.5	6.5
	Nominal Battery Pack Voltage [V]	288	288
att	Battery Capacity [A-h]	300	266
e H	Battery Pack Mass [kg]	2880	2550
	Ultracap. Max Voltage [V]	-	300
2	Ultracap. Capacitance [F]		2.0
5	Ultracap. ESR (Ω)		1.5
ទួទ	# Ultracaps in Series		ī
to t	# Ultracaps Strings in Parallel		8
aci	Ultracap. Bank Max Voltage [V]	•	300
ਰ ਹੱ	Ultracap, Bank Equivalent Cap. [F]	•	16
La.	Ultracap. Bank Equivalent ESR (Ω)		0.1875
i i	Ultracap. Bank Mass [kg]	•	280
	DC/DC Converter Mass [kg]		50

Table 3. CARTA AVS 22' EV bus configurations, with and without ultra-capacitor energy storage system

Table 4. RMS current of AVS EV Bus Battery Pack

	Without Ultracapacitors	With Ultracapacitors
Manhattan Cycle	99.1 A	73.8 A
Orange County Cycle	125.4 A	106.1 A
UDDS Cycle	163.5 A	149.0 A

Table 5. RMS Current per Kilogram of AVS EV Bus Battery Pack

	Without Ultracapacitors	With Ultracapacitors
Manhattan Cycle	34.1mA/kg	28.6mA/kg
Orange County Cycle	43.1mA/kg	41.1mA/kg
UDDS Cycle	56.2mA/kg	57.8mA/kg



Figure. 18. Battery Currents Histograms of AVS EV Bus Model with and without Ultracapacitor Energy Storage System, Manhattan Drive Cycle. . Data is displayed to emphasize percentages at high current levels.



Figure. 19. Battery Currents Histograms of AVS EV Bus Model with and without Ultracapacitor Energy Storage System, Orange County Drive Cycle. . Data is displayed to emphasize percentages at high current levels

The results show a reduction of RMS current per kilogram of 16% in the Manhattan driving cycle, 5% in the Orange County driving cycle, and an increase of 3% in the UDDS cycle. That the benefits of the ultracapacitors are more markedly shown in the Manhattan cycle is expected due to the larger number of starts and stops. It is worth remarking that the bus model with the ultracapacitor system has a reduced battery pack size of approximately 11%, which can also be considered a benefit. However, the reduced capacity of the battery pack, which occurred due to the assumption of conserving mass when adding the ultracapacitors, could be a concern for pure electric buses.

### V. CONCLUSIONS

The results of this project suggest that an ultra-capacitor energy storage system can offer significant reduction to the RMS and peak battery currents in electric and hybrid-electric mass-transit vehicles operating in driving cycles that consist of a large number of starts and stops, such as the Manhattan driving cycle. The benefits of an ultra-capacitor energy storage system are perhaps somewhat understated in this work. To allow direct comparison, simulations with and without ultra-capacitors used the same regenerative braking scheme, where regenerative braking takes up 50% of total braking. With an ultra-capacitor energy storage system, the electrical system could handle a higher percentage of regenerative braking, thus improving the efficiency of the overall system. Furthermore, it is believed that additional optimization of both the ultra-capacitor energy storage system and the energy management controller for specific vehicle configurations and drive cycles could yield significant improvements in performance. Future work in this area should address these issues.

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