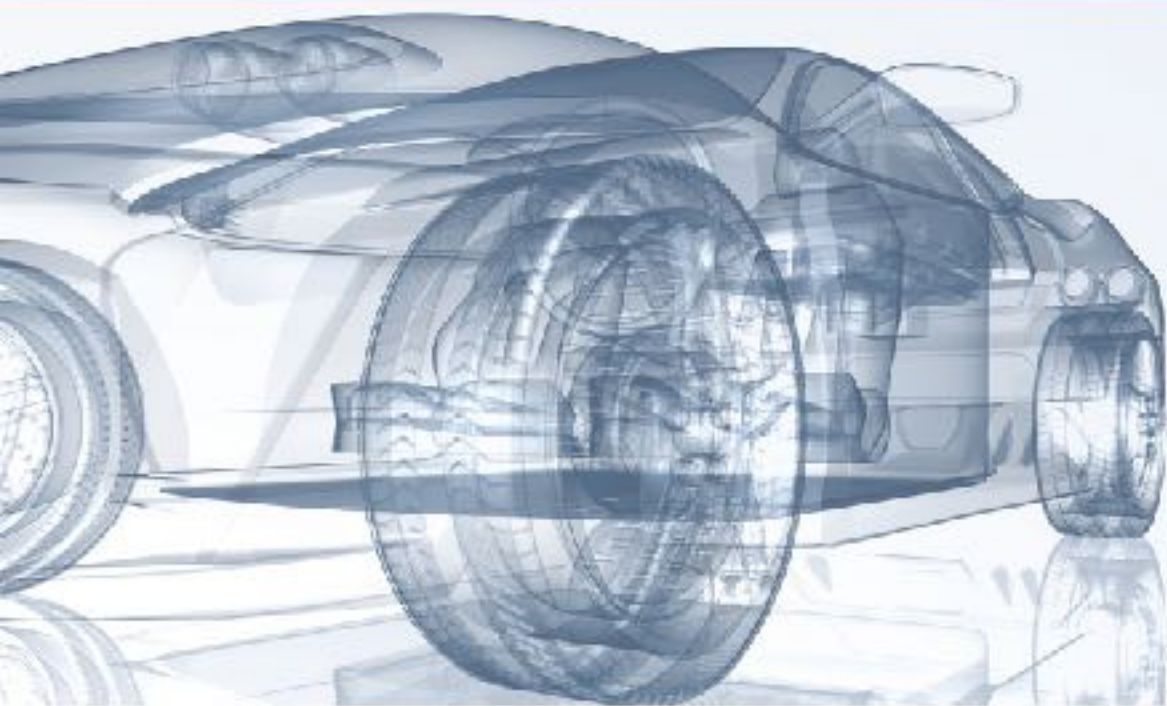


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# Predicting the Future Manufacturing Cost of Batteries for Plug-In Vehicles for the U.S. EPA 2017-2025 Light-Duty Greenhouse Gas Standards

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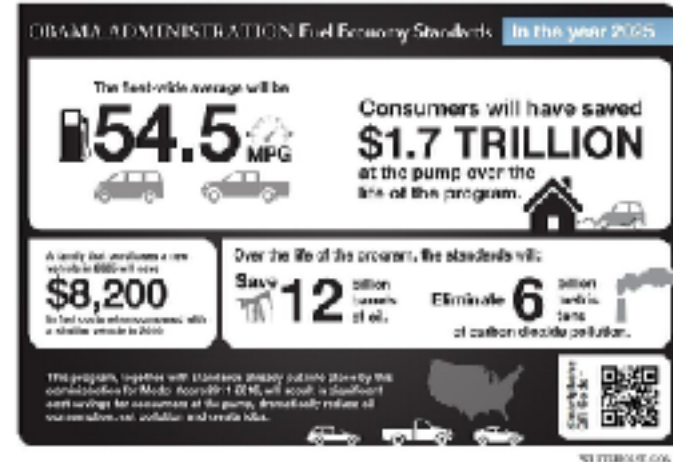


- Why EPA models battery costs for PEVs
- Outline of the sizing and costing methodology
- Major inputs, data sources, and how we chose them
- How our battery sizing compares to actual PEVs
- How our projected costs compare to other sources

# Why does EPA model battery costs?

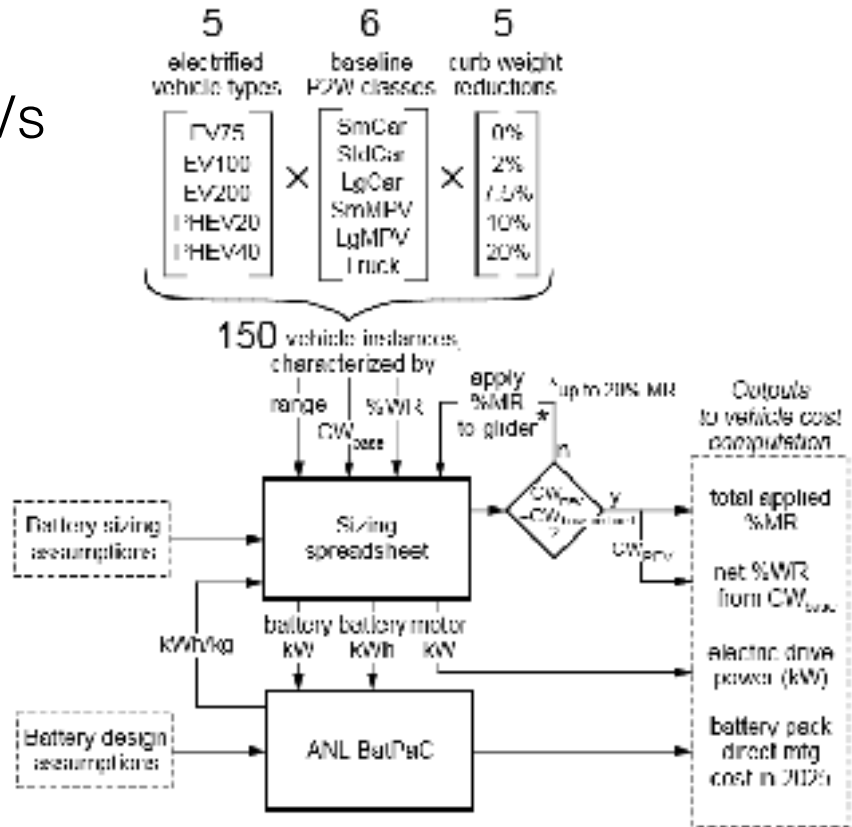


- The 2017-2025 Light-Duty GHG standards were developed between 2010-2012
- One important consideration was the cost of technologies available to comply with the standards
- Plug-in Electric Vehicles (PEVs) are one of these technologies
- EPA has assessed PEV battery costs several times:
  - When the standards were first developed in 2012
  - In July 2016 for the Draft Technical Assessment Report (TAR)
  - In November 2016 for the Proposed Determination
- The EPA Administrator has announced that he is reconsidering the Jan. 2017 Final Determination, and plans to make a new Final Determination by April 1, 2018
- Staff continues to review new data and information for all technologies, including PEV battery costs



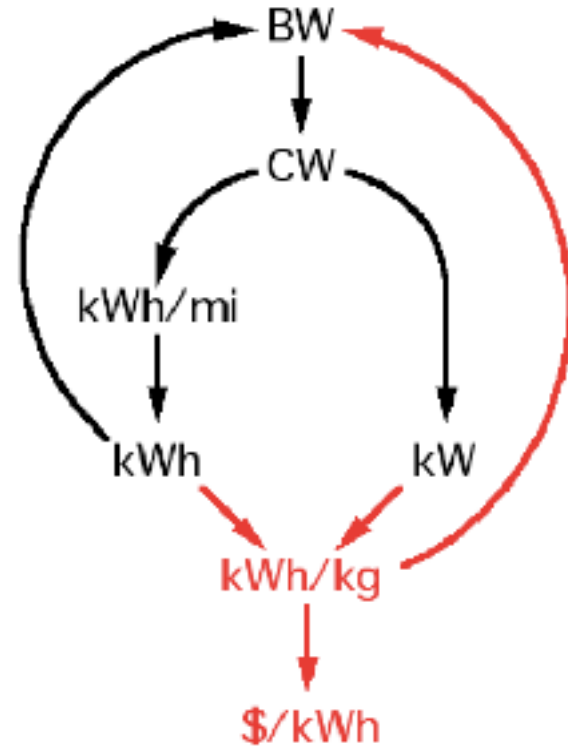
# Battery cost modeling approach

- 1 Define a broad spectrum of PEVs representing the future fleet
- 2 Determine required battery capacity and power for each
- 3 Use ANL BatPaC to estimate direct manufacturing cost



# Specifying a battery is complex

- Capacity (kWh) and power (kW) are the primary parameters
- Required kWh depends on vehicle energy consumption (kWh/mi)
- kWh/mi depends on vehicle curb weight
- Curb weight depends on battery weight
- Battery weight depends on required kWh and specific energy (kWh/kg)
- kWh/kg depends on kWh and kW
- *Computational shortcuts are tempting, but they can introduce vulnerabilities*



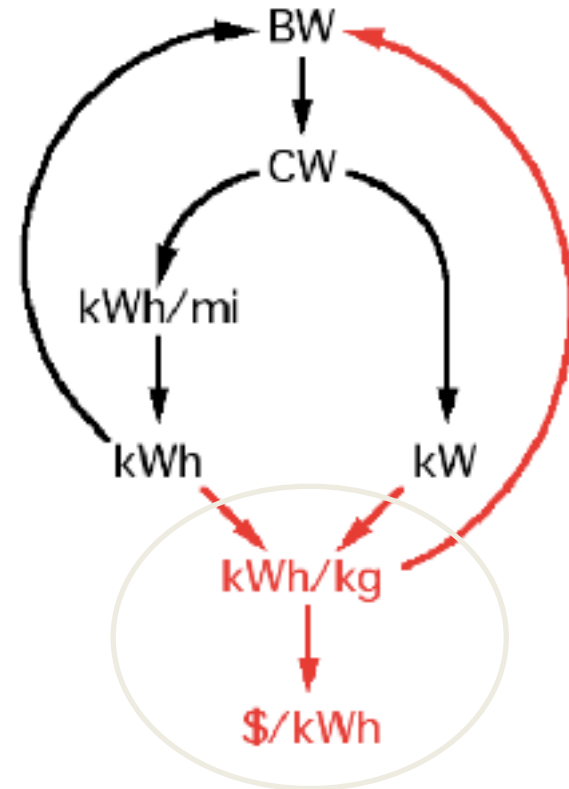
# Goal: Avoid vulnerabilities, such as:



- Assuming a constant \$/kWh for all vehicles
  - Not sizing the battery specifically to the vehicle class
  - Not accounting for the efficiencies of larger batteries
  - Not accounting for the cost of power
- Assuming a fixed kWh/mile for all vehicles
  - Not accounting for the effect of vehicle weight
  - Not distinguishing between vehicle classes
- Neglecting battery design
  - Not specifying the cell and module topology
  - Not accounting for the scale of production

# ANL BatPaC is a key component

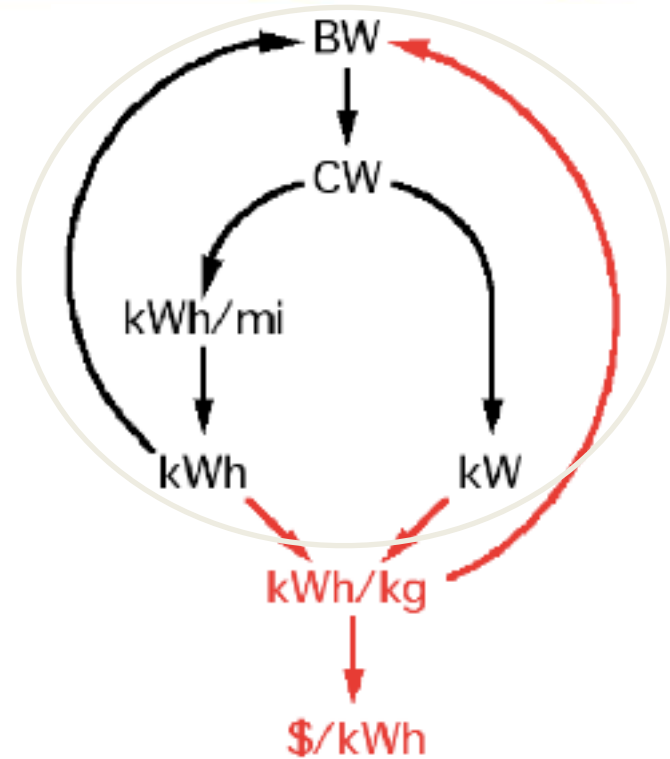
- Peer-reviewed, bill-of-materials based model by Argonne National Lab
- Key inputs:
  - Gross capacity (kWh)
  - Peak power (kW)
  - Topology (cell and module)
  - Thermal medium
  - Production volume
- Key outputs:
  - Specific energy (kWh/kg)
  - Direct manufacturing cost (\$)
- However, it can't help with determining required kWh or kW





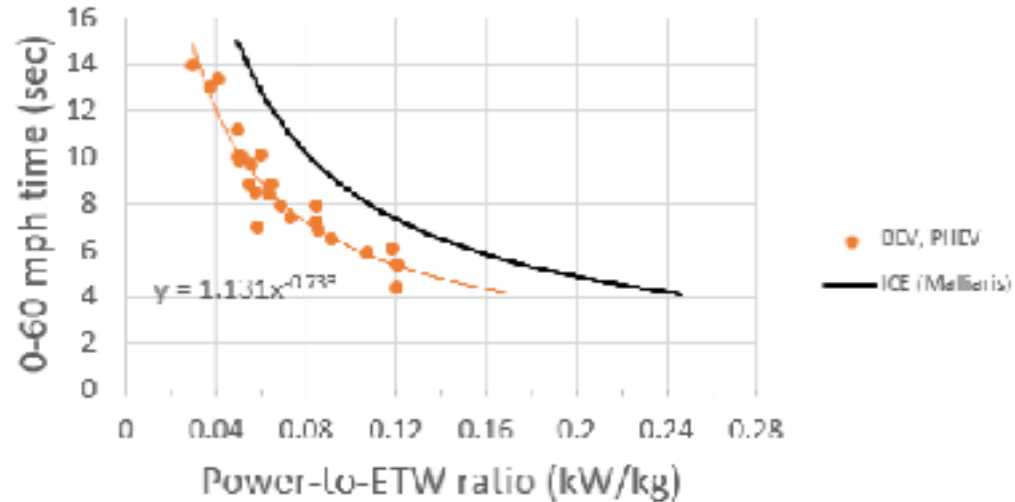
# Battery sizing spreadsheet

- Determines kWh and kW for a given vehicle:
  - Curb weight is converted to kW by an empirical equation
  - Curb weight is converted to kWh/mi by another empirical equation
  - Estimates of kWh and kW are fed to BatPaC, which responds with an estimated kWh/kg
  - kWh/kg is used to estimate battery weight
  - The solution converges after dozens of iterations



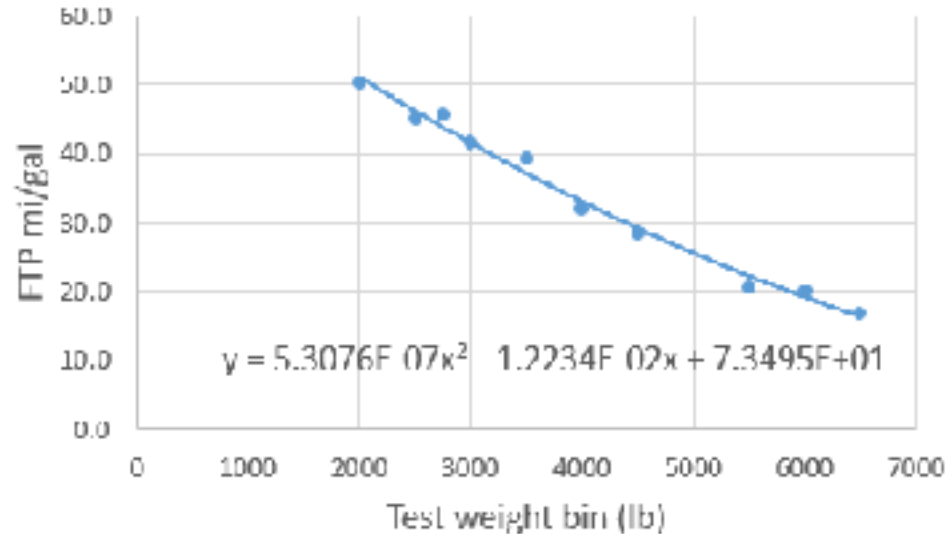
# Converting curb weight to kW

- The propulsion motor is sized using an empirical equation that relates 0-60 time to rated peak motor power
- Battery peak power (10 s) is derived from motor power:
  - 10% is added for motor losses
  - Additional 20% for power fade
- Larger batteries usually exceed the specification due to their capacity
- These batteries should therefore support moderate levels of fast charging



# Converting curb weight to kWh/mi

- We begin with a polynomial regression for ICE fuel economy (mi/gal) as a function of test weight
- ICE fuel economy is then converted to kWh/mi:
  - Assuming 33,700 kWh/gal
  - Applying factors representing relative efficiency of electric powertrain vs. ICE
  - Applying road load reduction due to reductions in aero and tire losses
- PEV kWh/mi can then be assigned as a function of test weight



# Many other variables impact cost



- Driving range
- Range derating factor (for real-world range)
- Topology
  - Cell capacity
  - Cells per module
  - Parallel strings
  - Pack voltage
- Usable SOC window
- Thermal medium (liquid or air)
- Electrode dimensions (thickness, aspect ratio)

- BEVs were modeled with range of 75, 100, and 200 miles
- Range is an “EPA label” range computed by applying a derating factor to a combined test range (55/45 city/highway)
- For BEV75 and BEV100, derating factor is 70%
- For BEV200, derating factor is 75%
- Based on observed industry practice in certification process
  - Most manufacturers certify with default 70%
  - Longer range Tesla vehicles have used an optional procedure that equates to using 73-77%

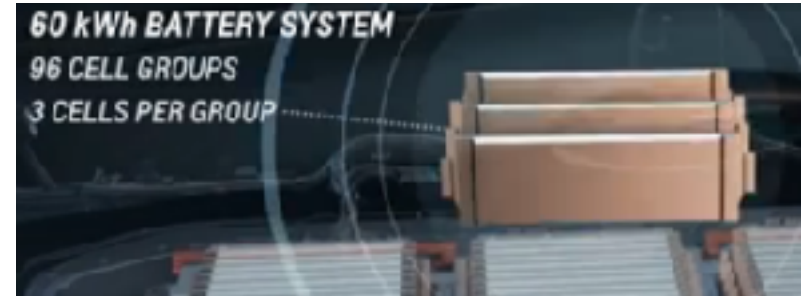
# Pack topologies are optimized

- For a given pack capacity (kWh), iterate all valid topology possibilities
  - Cells/module (20 to 40, even numbers)
  - Cells in parallel (1 to 4)
  - Modules per row (1 to 4)
  - Number of rows (1, 2, or 4)
- Each topology combination determines a cell capacity (A-hr) and pack voltage (V)
- Choose the topology that has a voltage and cell capacity nearest the target
  - Max cell capacity: BEV 90 Ah, PHEV 50 Ah
  - Pack voltage: ~ 300 V to 400 V

```
WHILE (i < max_row) DO
  BEGIN
    min_error := 100000;
    cells_per_module := 20 //max 40
    WHILE (cells_per_module <= 40) //max 40
      INCR
      IF (cells_per_module/2) = (cells_per_module DIV 2) THEN //max cells per module
        BEGIN
          cells_in_parallel := 1;
          WHILE (cells_in_parallel <= 4) DO
            INCR
            IF (cells_per_module/cells_in_parallel = cells_per_module DIV cells_in_parallel) THEN
              BEGIN
                modules_per_row := 1;
                WHILE (modules_per_row <= 4) DO
                  INCR
                  rows := 1;
                  WHILE (rows <= 4) DO
                    BEGIN
                      IF (rows <= 2) THEN
                        BEGIN
                          //do stuff here
                          total_cells := rows*1000/cell_size*rows;
                          cells_per_pack := cells_per_module * modules_per_row * rows;
                          cur := cells_per_pack * cell_v // cells_in_parallel;
                          cell_ah := (cur/i) * 1000 / cell_v // cells_per_pack;
                          IF (cur <= 400) AND (cur >= 200) THEN
                            BEGIN
                              IF (cell_ah <= max_cell_ah) THEN
                                BEGIN
                                  //use this to get closest to max size
                                  this_error := abs(max_cell_ah - cell_ah);
                                  IF (this_error < min_error) THEN
                                    BEGIN
                                      min_error := this_error;
                                      best_get_1 := xSTR(int(1)) + '.' + xSTR(cells_per_module) + '.' + xSTR(ol
                                      AND;
                                      AND;
                                    END;
                                  END;
                                END;
                              END;
                            END;
                          END;
                        END;
                      END;
                    END;
                  INCR(modules_per_row);
                END;
              END;
            INCR(cells_in_parallel);
          END;
        END;
      INCR(cells_per_module);
    END;
```

# Other influential parameters

- Electrode aspect ratio 3:1
  - Automakers indicate trend toward flat, floor-mounted packs
  - Tabs on short dimension to minimize height (like Chevy Bolt)
- Electrode thickness  $\leq 100$  microns
- All packs liquid cooled
- Usable capacities
  - BEV200: 90%
  - BEV75/100: 85%
  - PHEV20/40: 65% - 67%



*Trend toward flat, floor mounted packs  
using large, low-profile cells*

# Validation against specific BEVs

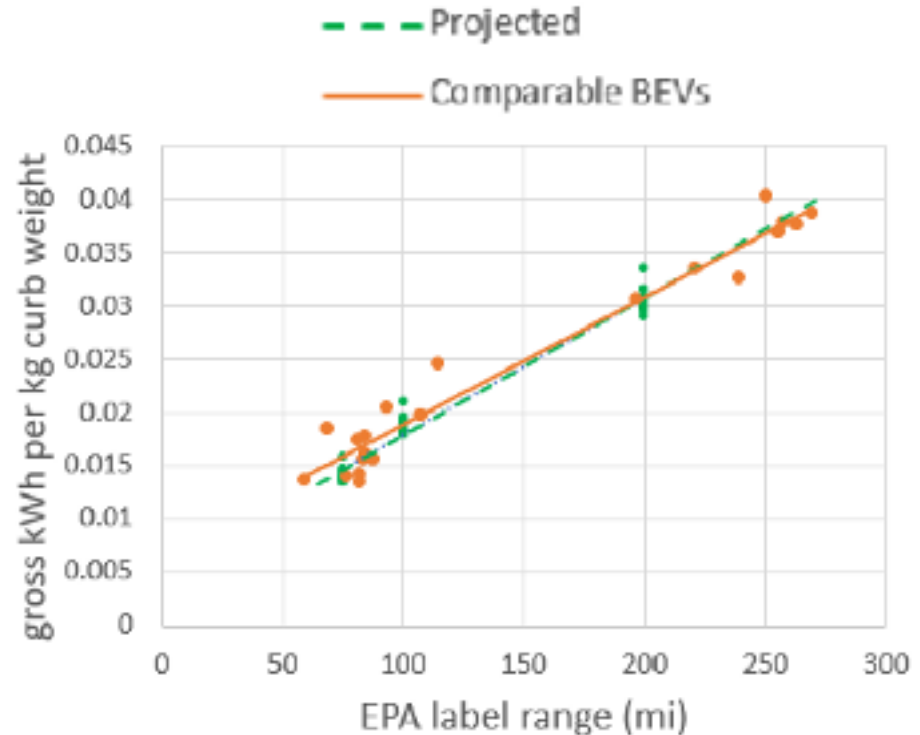


Example	Range (mi)	Curb weight (lb)	Derate factor	Gross kWh	EPA projected gross kWh	Error
Nissan Leaf	107	3340	0.70	30	30.3	1%
Chevy Bolt	238	3580	0.70	60	61.6	3%
Model S P85D	253	4963	0.738	85	88.75	4%
Model S 60	210	4323	0.796	60	57.5	-4%
Model S 85	265	4647	0.796	85	84	-1%



# Validation against production BEVs

- When normalized to curb weight, the predicted battery capacities closely track comparable production BEVs
- The methodology is designed to expect slightly more improvement for shorter range BEVs
- Results are similar for PHEVs



# Variability in cost per kWh is captured



	PHEV20	PHEV40	BEV75	BEV100	BEV200
CW Class 1	\$371-\$388	\$250-\$258	\$205-\$223	\$173-\$185	\$145-\$151
CW Class 2	\$352-\$365	\$242-\$251	\$193-\$211	\$165-\$177	\$137-\$144
CW Class 3	\$337-\$361	\$237-\$247	\$186-\$205	\$159-\$172	\$133-\$140
CW Class 4	\$319-\$346	\$232-\$246	\$176-\$204	\$155-\$165	\$126-\$134
CW Class 5	\$277-\$309	\$227-\$241	\$160-\$189	\$146-\$155	\$115-\$124

# Comparison to Chevy Bolt costs



- Chevy Bolt = BEV238, 150 kW, 60 kWh, known topology
- GM publicized cell-level costs (not pack-level costs)
- If we can convert them to pack-level costs, we can make a qualified comparison to our projected BEV200 pack costs

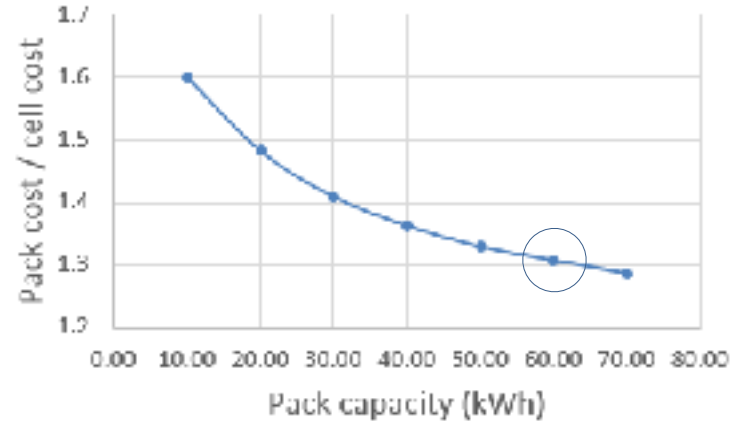


*Mark Reuss, GM: “When we launch the Bolt, we will have a cost per kWh of \$145, and eventually we will get our cost down to about \$100.”*

- GM Global Business Conference, October 2015

# Converting cell cost to pack cost

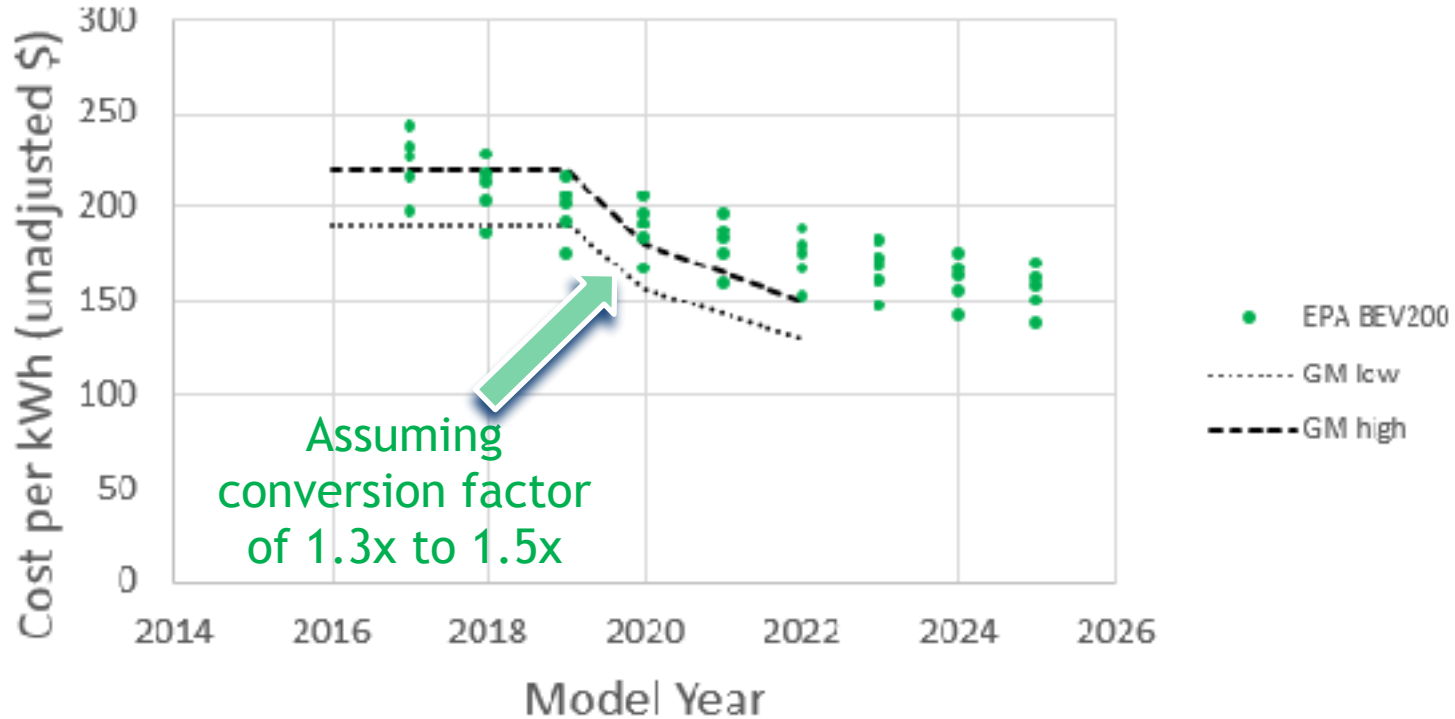
- BatPaC suggests the ratio of pack cost to cell cost for a 60 kWh pack should be about 1.3
- The 2017 teardown of the Chevy Bolt by UBS suggests a ratio of about 1.44
- We will assume a ratio of 1.3-1.5



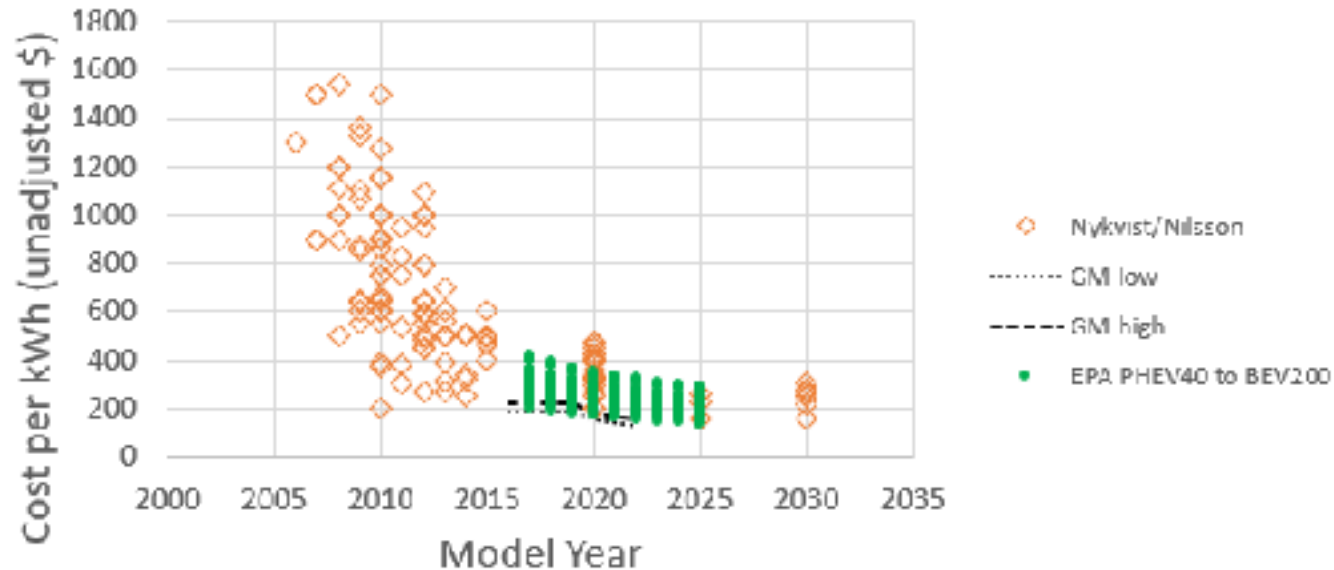
“UBS Evidence Lab Electric Car Teardown – Disruption Ahead?,” May 18, 2017.



# Comparison to estimated Bolt pack cost



# Comparison to Nykvist & Nilsson



Nykvist, B. and Nilsson, M.; "Rapidly Falling Costs of Battery Packs for Electric Vehicles," Nature Climate Change, March 2015.

- Battery technology continues to develop rapidly
- Our 2012 estimates went from being considered optimistic to being considered conservative
- We continually monitor trends and developments in the industry
- Our most recent estimates remain close to stakeholder consensus
- We have continued to assess new data and information that has become available this year
  - Plan to model 100, 150, and 200 mile driving ranges
  - New version of BatPaC includes updated material costs
  - Batteries will be designed for specific levels of DC fast charging
  - All non-battery costs have also been updated

# Thank you



- For more information on the methodology, inputs, and data sources, see [Chapters 2.2.4.5 and 2.3.4.3.7 of the Technical Support Document \(TSD\)](#) for the 2016 Proposed Determination, EPA 420-R-16-021, November 2016.
- For information on the Midterm Evaluation, visit: <https://www.epa.gov/regulations-emissions-vehicles-and-engines/midterm-evaluation-light-duty-vehicle-greenhouse-gas>



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