



# ***Self-Discharge Measurements for Cells in Cycling Li-Ion Batteries***

***Albert H. Zimmerman  
The Aerospace Corporation***

***23 April 2024  
Space Power Workshop***

Note: Pictures, Graphs and Diagrams shown  
on the briefing charts are notional items, not exact.

Approved for public release. OTR 2024-00502.



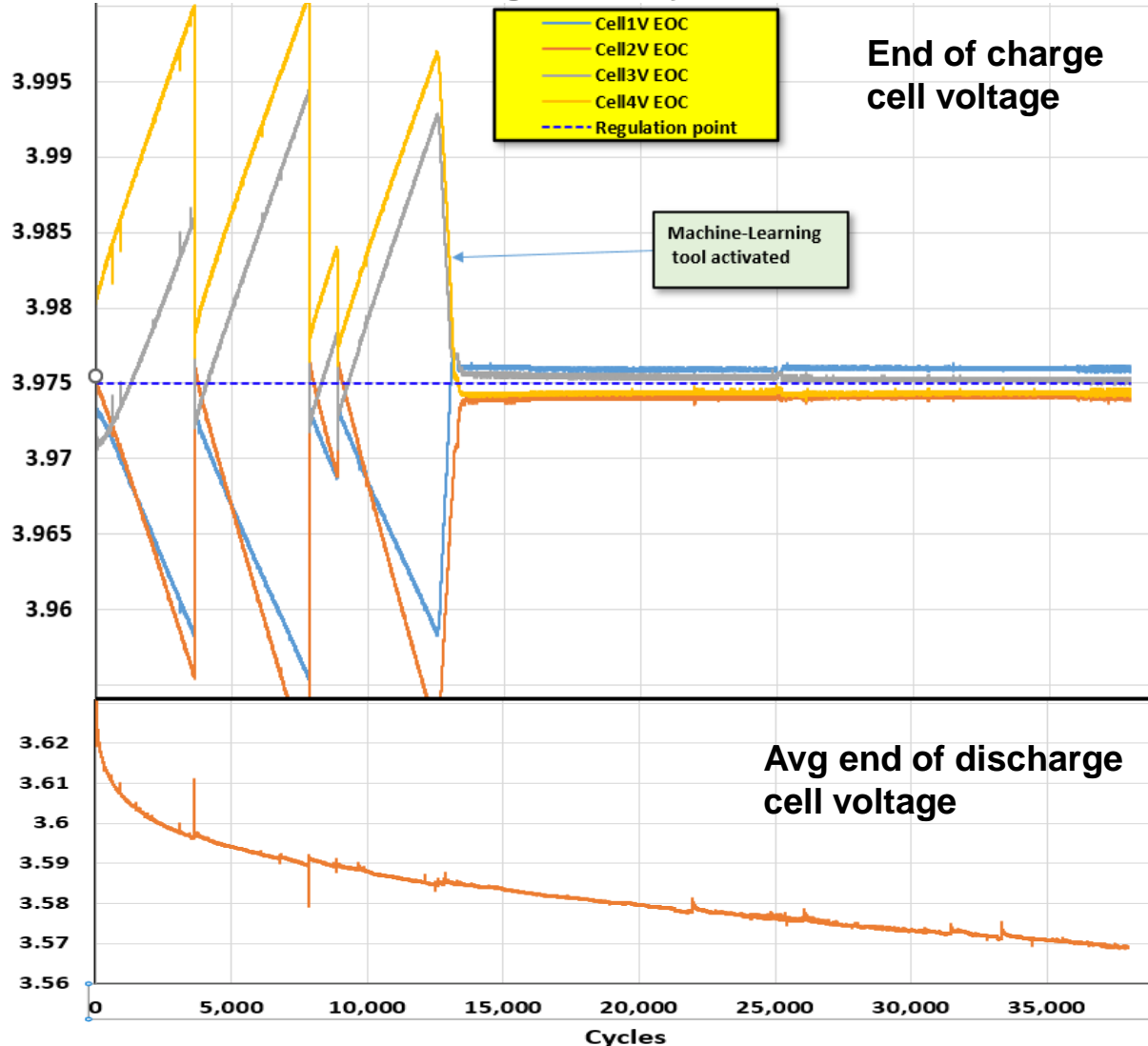
# Measurement of Cell Self-Discharge Loss While Li-Ion Batteries are Operating

- **Why do we care about Li-ion self-discharge (typically  $<C/20,000$ )?**
  - *Self-discharge can create capacity imbalance between cells in batteries*
  - *Sudden significant changes may signify impending cell problems*
- **Battery charge and discharge operation prevents traditional measurements of open-circuit cell voltage decay rates**
- **We have developed a Machine Learning (ML) tool that continuously monitors cell self-discharge in operating Li-ion batteries**
  - *Can be added to an operating battery control system*
  - *Requires access to cell voltage measurements*
  - *Continuously learns the duty-cycle for switching 10-50 Kohm across each cell to keep cells in each string balanced, which provides the internal cell losses*
- **Data will be shown for four batteries where we recently added ML tool**
  - *Battery 1 (four 12-Ah cells): LEO cycling for 7+ years*
  - *Battery 2 (four 7-Ah cells): LEO cycling for 23 years*
  - *Battery 3 (four 40-Ah cells): accelerated GEO cycling after storage for 16 years*
  - *Battery 4 (three 40-Ah cells): LEO cycling for 22 years*



# Battery 1: Four 12 Ah Li-Ion Cells

- 7+ Year LEO operating history at 30% DOD, 3.975 V/cell charge voltage



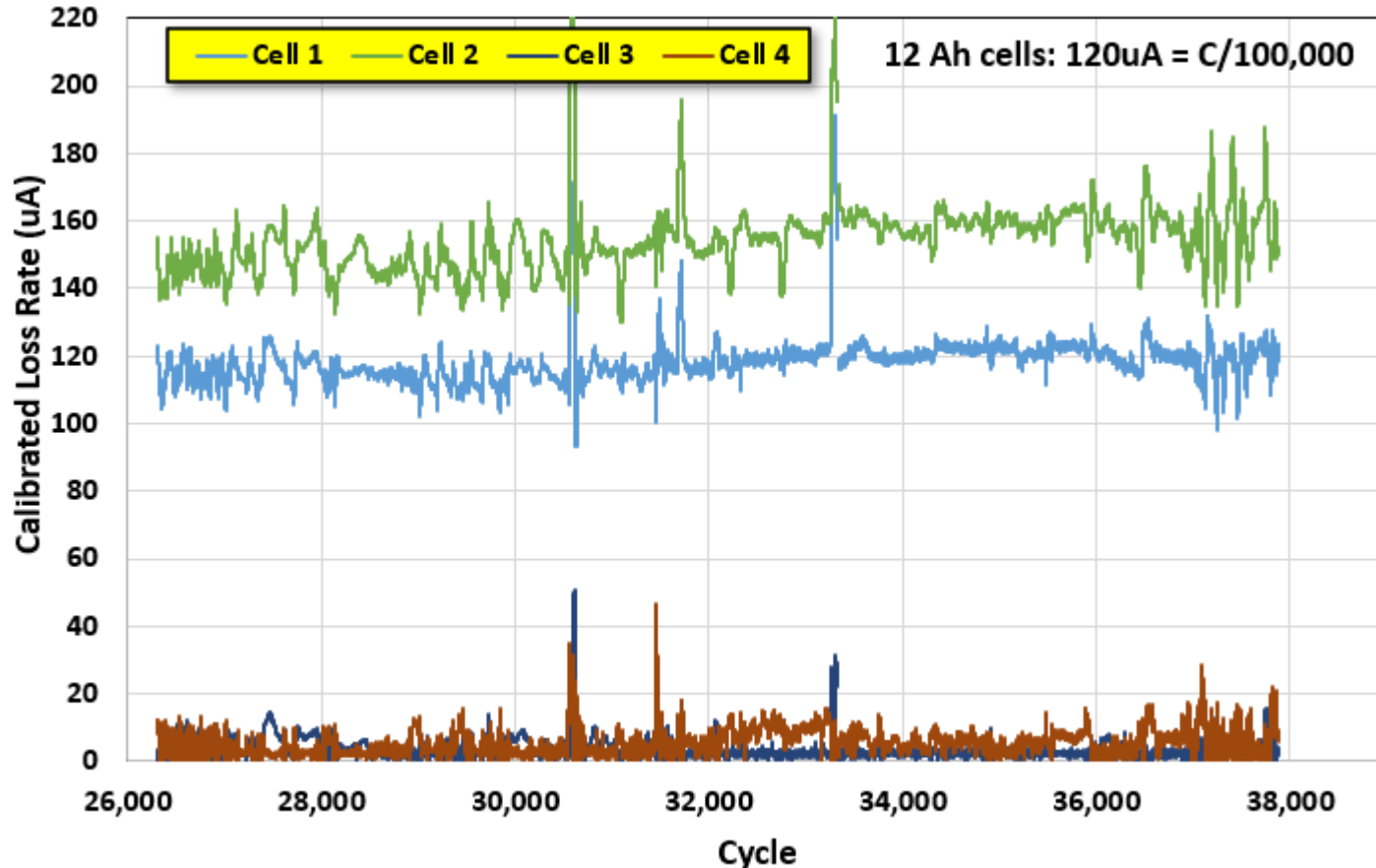
- Cells periodically manually rebalanced during first ~14,000 cycles
- ML tool run after cycle ~14,000 to monitor self-discharge while keeping cells balanced

- Essentially no effect on battery discharge voltage performance



# Battery 1 Self-Discharge History

- Self-discharge loss rates generally stable for last 12,000 cycles

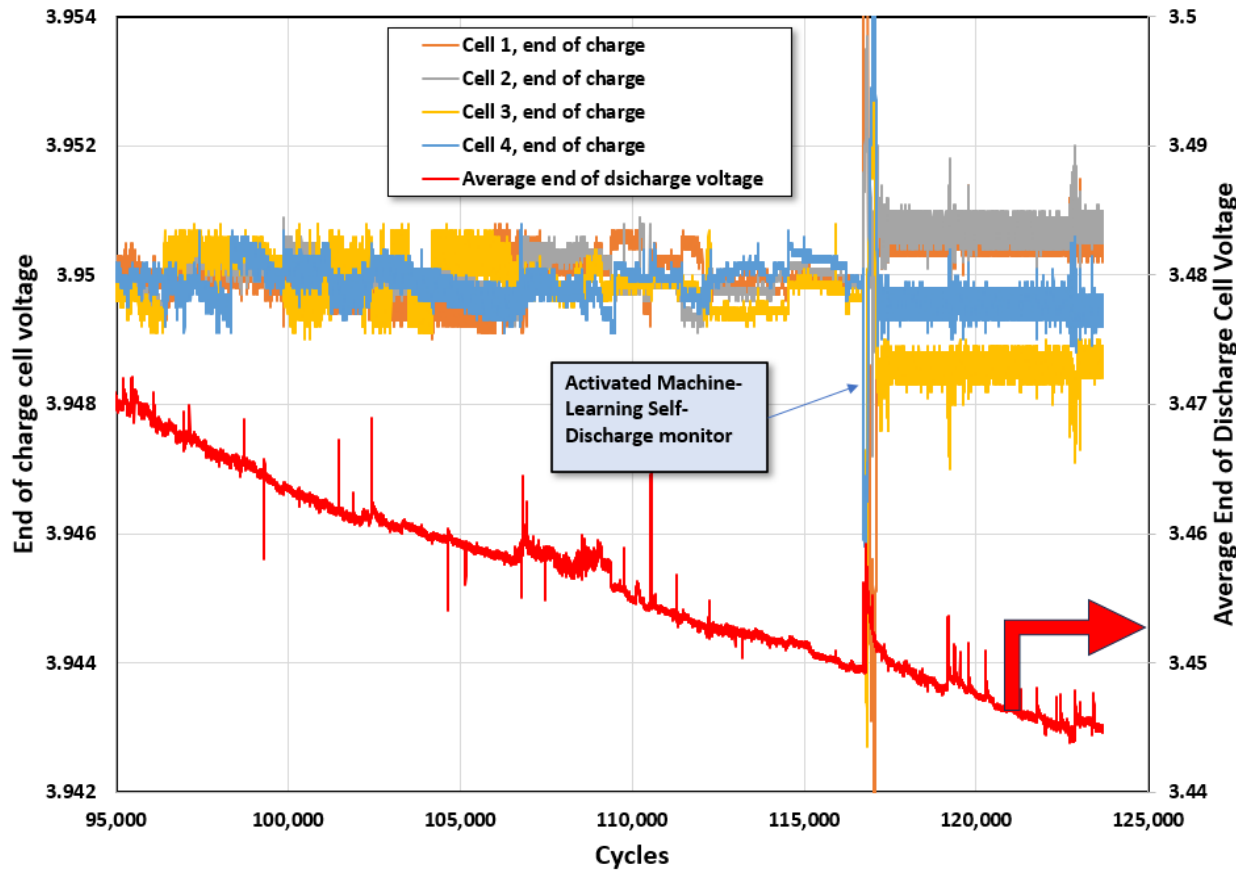


- Can fluctuate due to test interruptions or temperature fluctuations
- Cause for recent fluctuations for cell 2 is uncertain



# Battery 2: Four-Cell 7Ah Li-Ion Battery

- 23-year LEO cycling history: 124,000 cycles at 20% DOD
- Charged battery to 3.95 V/cell



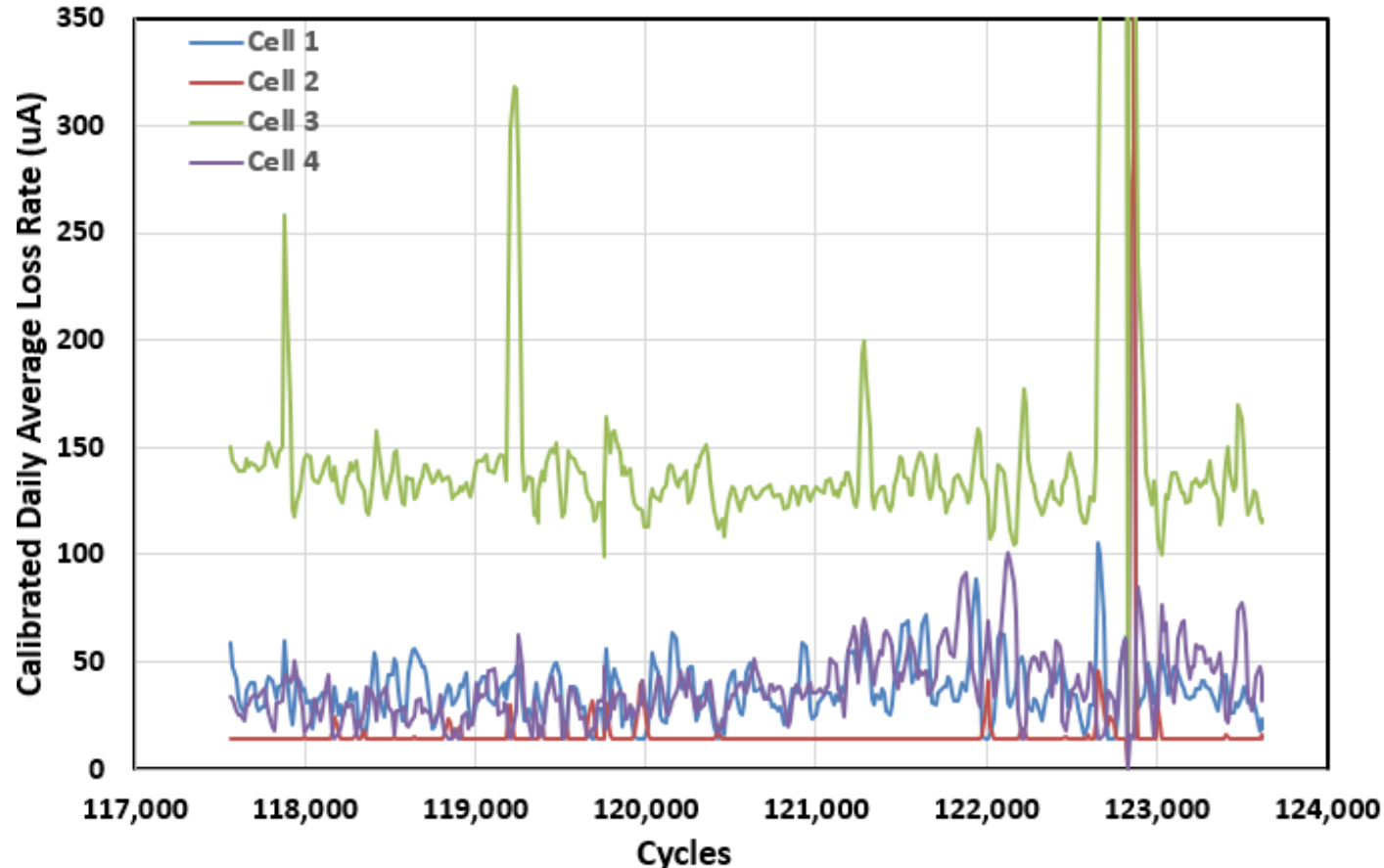
**Replaced cell charge voltage regulators with ML tool near cycle 117,000**

- Continuing stable cell and battery performance



# Battery 2 Self-Discharge History

- Self-discharge loss rates have been stable for last 6,000 cycles

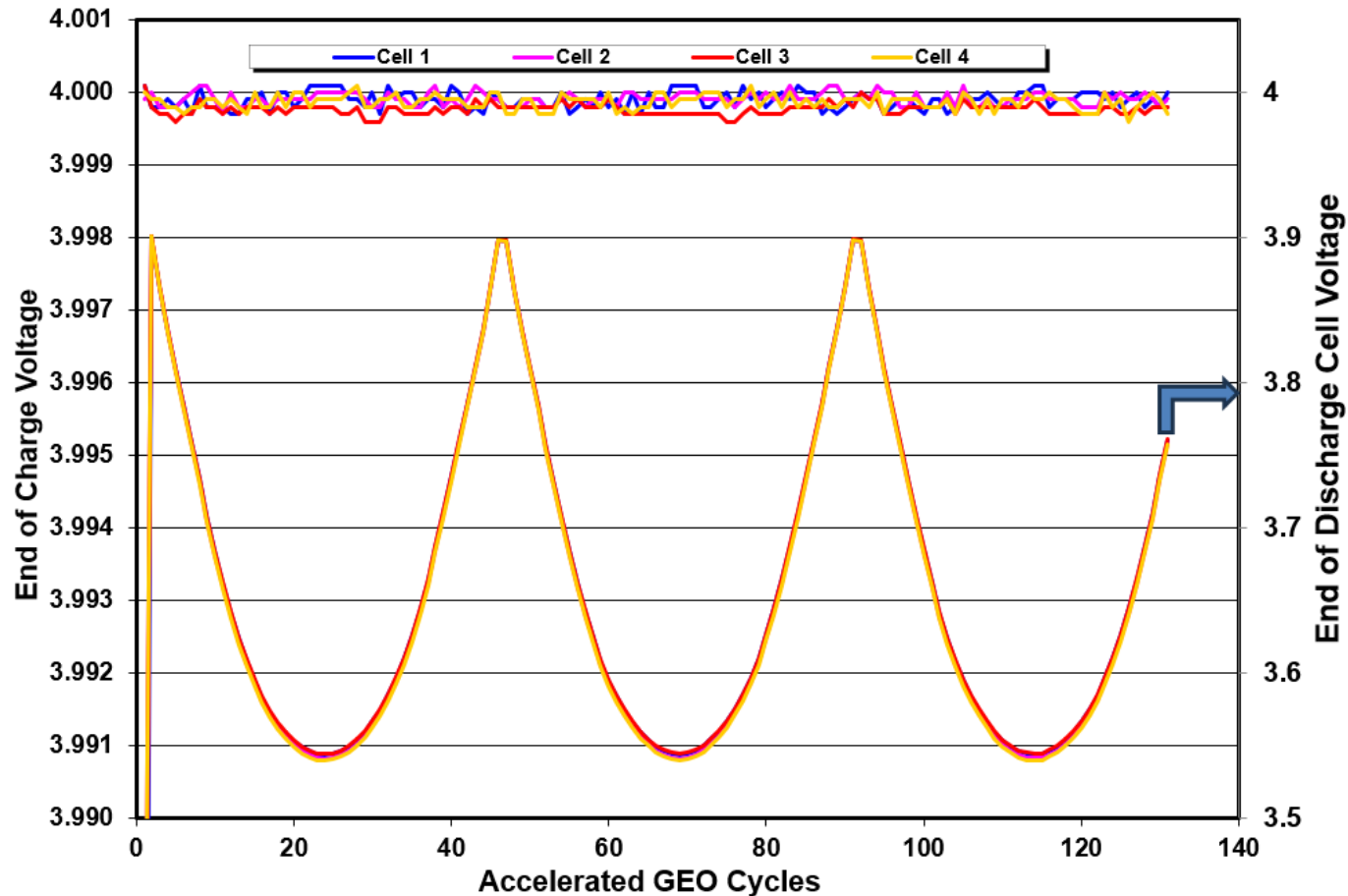


- Plotting a daily average takes out effects from daily temperature cycles
- Fluctuations sometimes observed when test interruptions occurred



## Battery 3: Four-Cell 40Ah Li-Ion Battery

- Accelerated GEO cycling history after 16 years of storage (3 seasons)
- Charge battery to 4.00 V/cell, ML tool for self-discharge monitoring

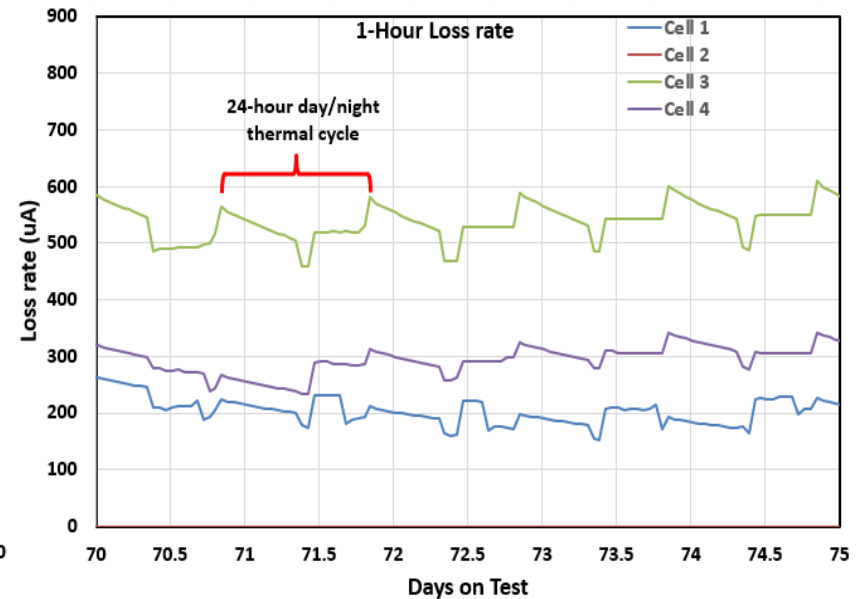
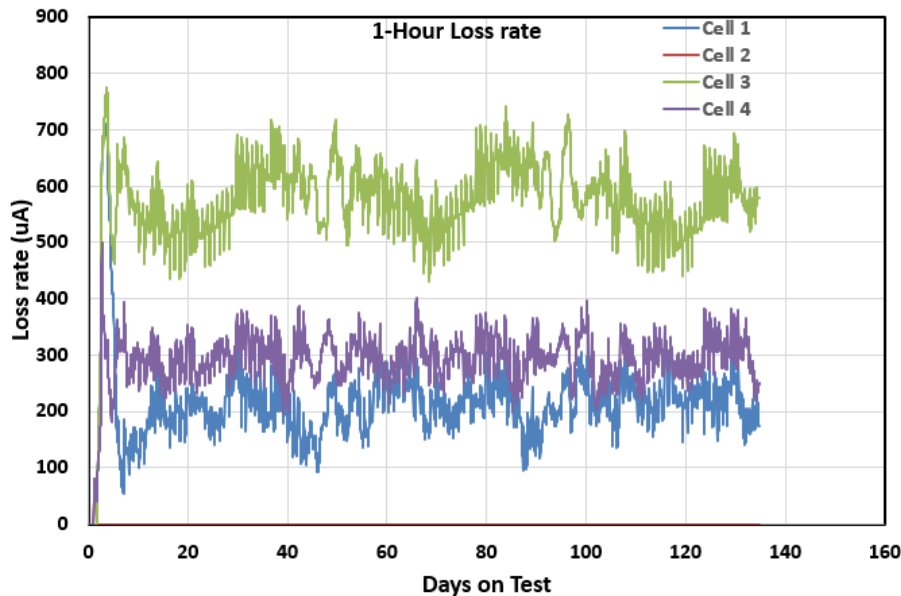


- Keeps cells precisely balanced while monitoring internal losses



# Battery 3 Self-Discharge History

- Self-discharge monitored every hour shows 24-hr repeated pattern
- Caused by small ( $<0.1^{\circ}\text{C}$ ) day/night temperature variation



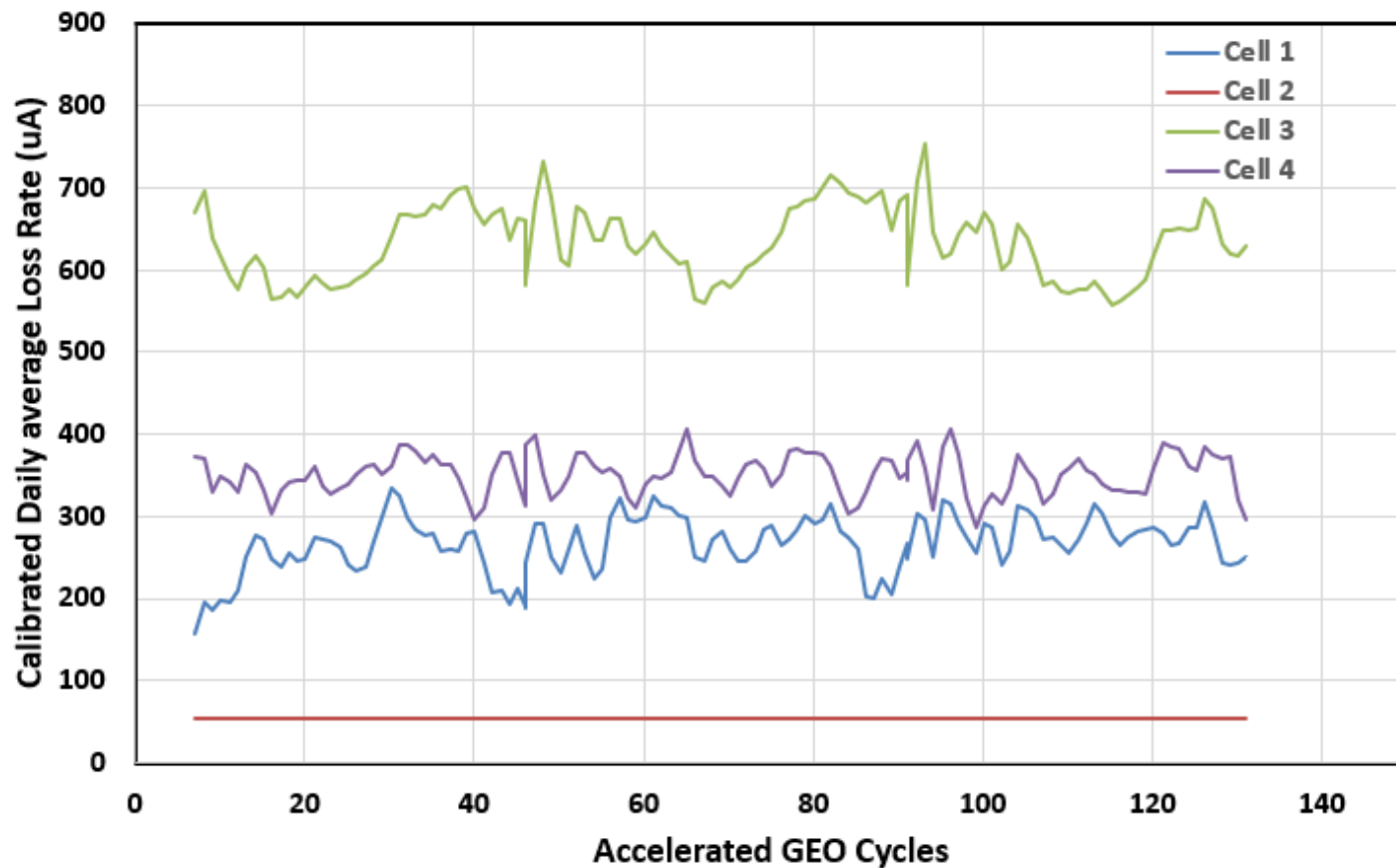
- Apparent internal losses are sensitive to temperature variations
- Day/night temperature effect can be removed by averaging over 24-hr





# Calibrated Battery 3 Daily Self-Discharge History

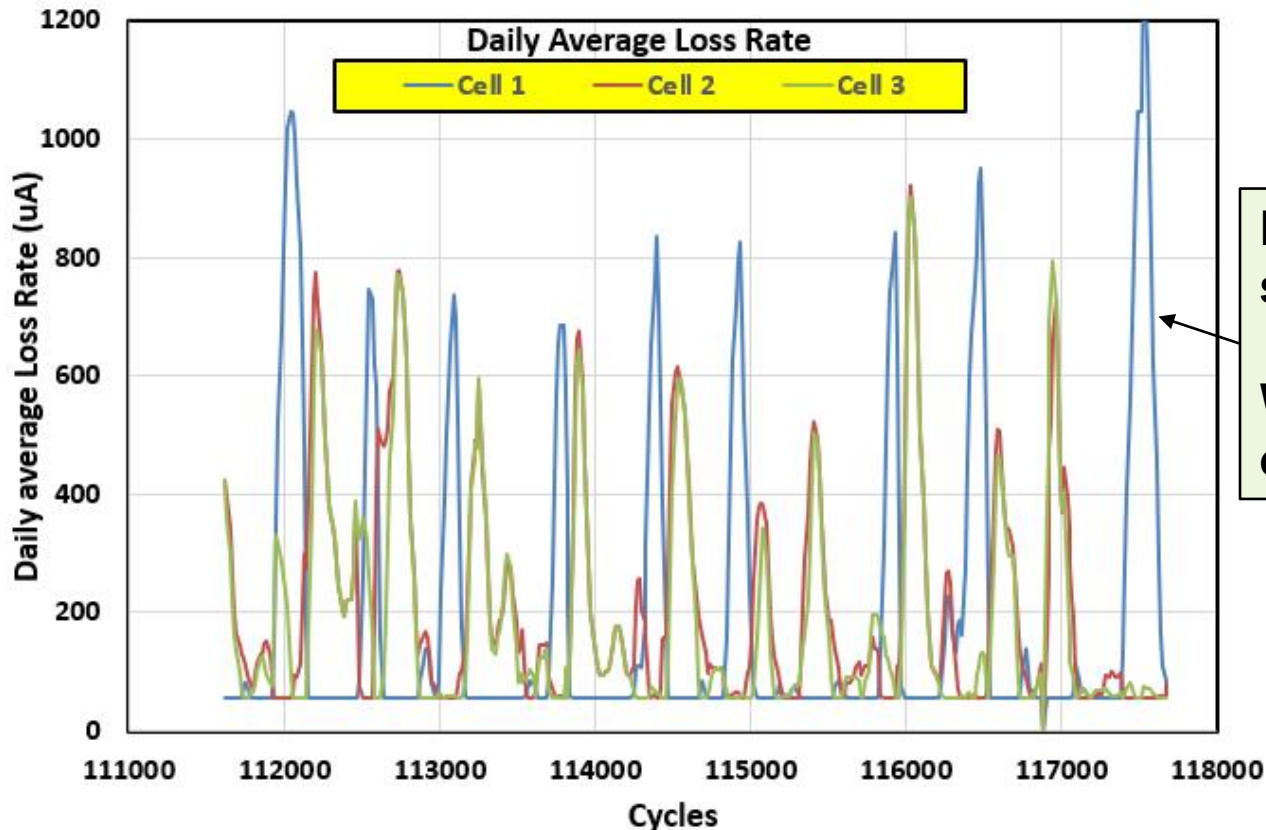
- 24-hr averaging removes effect of day/night temperature fluctuation
- Cell 3 shows depth-of-discharge fluctuation over 45-cycle season
  - *Internal cell losses are greatest during periods of low-DOD cycling*
  - *Other cells do not show this fluctuation*





## Three-Cell Battery 4 (40 Ah)

- LEO cycling for 22 years at 15-30% DOD (15% for last 6 years)
- Charge to 3.90 V/cell, ML tool self-discharge monitor last 6,000 cycles



Fluctuations  
seen for Cell 1

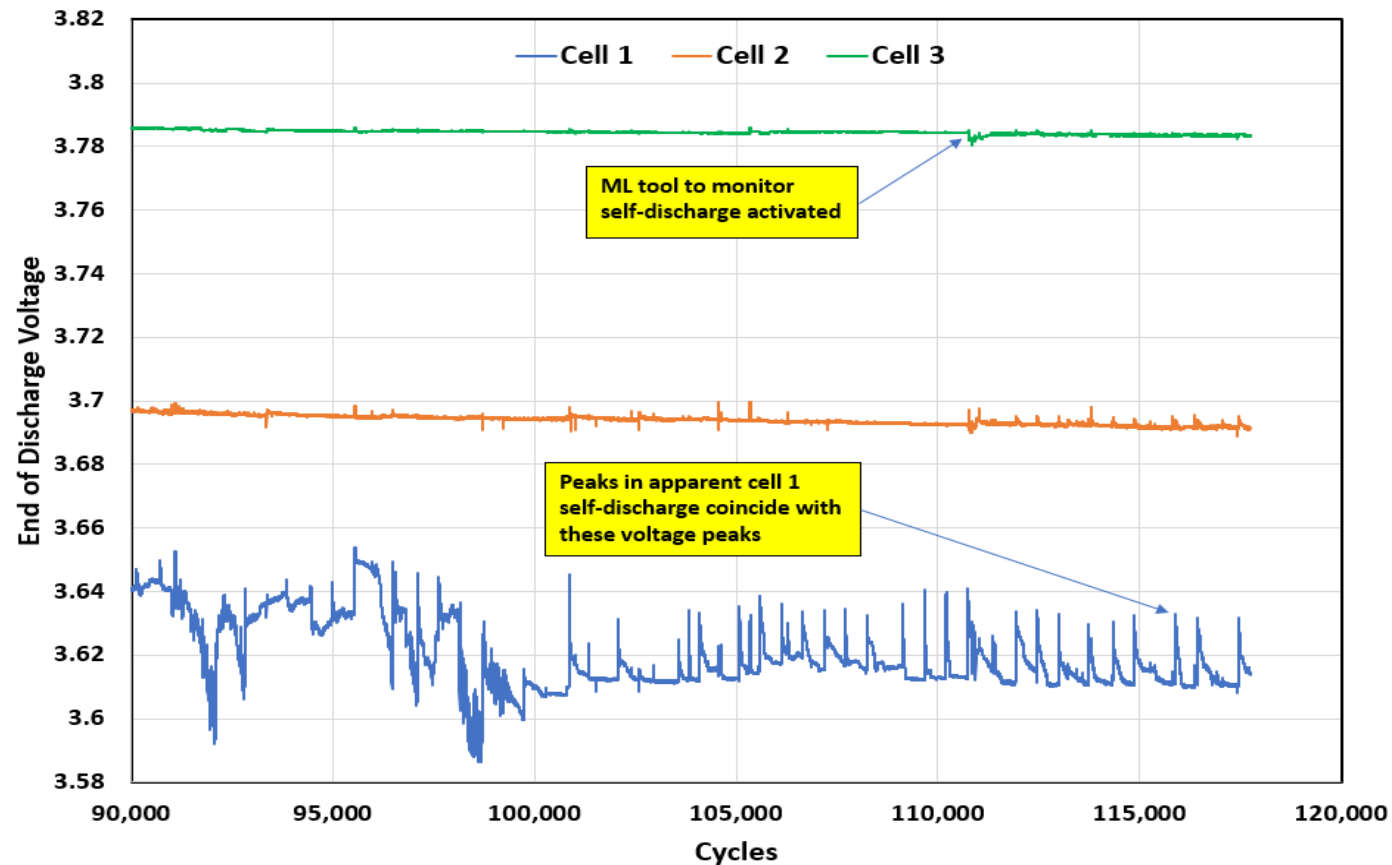
What is going  
on?

- Internal losses are not stable like other batteries we have trended
- Cell 1 periodically increases, then decreases as ML tool tries to learn



# Battery 4: Cell End of Discharge Voltages

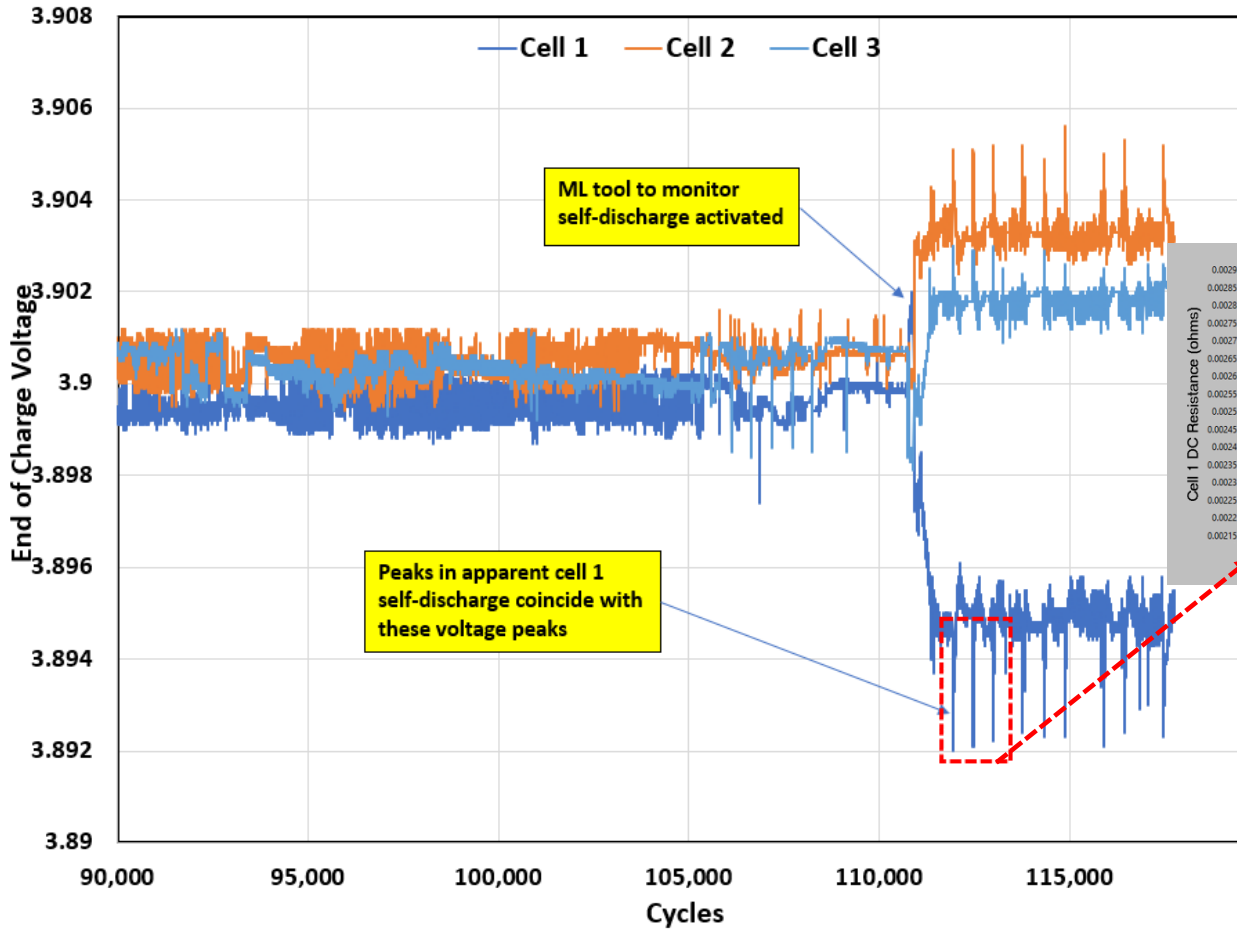
- Cell 1 is the most degraded and shows unusual voltage fluctuations
- Voltage fluctuations coincide with peaks in self-discharge detected by ML tool



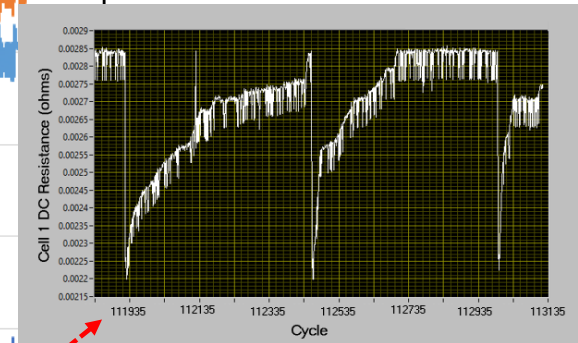


# Battery 4: Cell End of Charge Voltages

- Cell 1 voltage fluctuations caused by DC resistance changes shown



Voltage fluctuations are interpreted by ML tool as changes in internal cell losses



Cell 1 avg DCR during cycles in red box

- Cause for resistance changes not known, trending will continue



# Conclusions

- **Machine Learning (ML) can use battery data to learn and monitor apparent internal cell loss rates**
  - *Cell balancing can be a useful by-product*
- **Observed internal cell losses have been observed to be sensitive to parameters other than cell self-discharge**
  - *Cell temperature variations*
  - *Cell resistance changes*
  - *Operating state of charge range*
- **Measurements can be corrected for temperature variations**
- **Sudden changes can warn us of unusual cell behavior in a battery, and perhaps impending end-of-life**
  - *Increasing self-discharge*
  - *Resistance increases or fluctuations*
  - *Variations with state of charge or DOD*
- **Gives us a new tool to trend and better understand battery performance and changes over life**