





### Proof of Concept Magnetic Field Monitoring in Flooded Lead Acid Cells

Scarleth Vasconcelos MSSE svasconc@villanova.edu

Funded by Consortium for Battery Innovation PI: Dr. Pritpal Singh pritpal.singh@villanova.edu

College of Engineering, Villanova University, Villanova, PA 19085

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- 1- Introduction
- 2- Objectives of this Research
- 3- Methodology
- 4- Experimental Results
- 5- Conclusions

# Failure Modes in Lead Acid Batteries (LABs)



Introduction and Background



# Electrolyte Variations During Cycling



#### Introduction and Background

Acid stratification in flooded batteries can develop fast, leading to permanent damage due to inhomogeneous current distribution in the vertical direction of the electrodes.



#### Measurements of magnetic susceptibility provide insights about changes in H<sup>+</sup> concentration in the cell.

### **Research Gaps from Literature Review**



#### Introduction and Background

Lack of techniques that can accurately and comprehensively assess stratification in LABs at different SoCs.



Need for improved sensitivity, accuracy, and validation of methods such as magnetic field imaging, magnetic susceptibility monitoring, and magnetic field probing to predict battery SoH.



Further research is required for precise SoH estimation in flooded LABs.



# Proof of Concept Magnetic Field Monitoring



Introduction

Objectives

The motivation behind this research is the need for advanced techniques to detect stratification in flooded lead-acid batteries at different SoCs.

The general objective is to develop a real-time battery monitoring system that is non-invasive, non-destructive, and highly accurate for flooded LABs applications.

The objective of this stage is to measure the magnetic field response at the electrolyte level in full flooded lead acid cells.

# Magnetic Field Technique Working Principle



#### Introduction and Background

Through mutual inductance changes in magnetic field are mapped



Coupled Coils Setup



Primary and Secondary Coil Positioning with Electrolyte Solutions

# Resonance in magnetic field coupling between two external coupled coils can be used to detect stratification inside the cell.

An AC signal with variable voltage and frequency was applied to the primary coil, and the output voltage across the secondary coil was measured. The measurements were optimized to achieve the largest signal response in the output coil.

# **Objectives of this Research**



#### Objective 1:



Objective 1.1: Secondary Coil Output Voltage (SCOV) Variations at Individual Electrolytes



Objective 1.1: Secondary Coil Output Voltage (SCOV) Variations with Coil Separation at Electrolyte Level in a Full Cell during cycling



The magnetic field will be mapping using an array of magnetoresistive sensors for 6 cells, 200 cycles

Compare with magnetic imaging scans to identify correlations



- Map elemental composition of the electrodes
- Perform energy dispersive x-ray analysis

#### Objective 3:

Simulate the magnetic field mapping of flooded lead acid cells using finite element modeling in the COMSOL Multiphysics environment.



3D Lead Acid Cell Simulation-Adapted from Dr. Parmender Singh Model for Li-ion Electrochemistry.

The simulated results will be compared to the experimental findings obtained from objectives 1 and 2.

# Experimental Approach





Introduction

Prepare Electrolyte at Different Concentrations

| Preparation of Solutions   |                                     |                       |
|--|-------------------------------------|-----------------------|
| SG (H <sub>2</sub> SO <sub>4</sub> )                               | H <sub>2</sub> SO <sub>4</sub> (ml) | H <sub>2</sub> O (ml) |
| 1.07   | 20ml                                | 80ml                  |
| 1.14   | 40ml                                | 60ml                  |
| 1.20   | 60ml                                | 40ml                  |
| 1.33   | 80ml                                | 20ml                  |
| Table 1. Preparation of $10\%$ -40% H <sub>2</sub> SO <sub>4</sub> |                                     |                       |
| Solutions  |                                     |                       |



Objectives

pH Measurement at the Electrolyte Level

| H <sub>2</sub> SO <sub>4</sub>      | pH Theoretical   |  |
|-------------------------------------|--|--|
| <b>Concentration</b>                | Value  |  |
| 1.07                                | -0.337   |  |
| 1.14                                | -0.667   |  |
| 1.20                                | -0.872   |  |
| 1.33                                | -1.026   |  |
| Table 2. Theoretical pH for 10%-40% |  |  |
| H <sub>2</sub> SO <sub>4</sub> Co   | ncentrations   |  |
|                                     | and the second |  |



Methodology

Coupled Coils Measurements at Different Electrolyte Concentrations



Coupled Coils Measurements at the Cell Lower Electrolyte Level

| Input Data                     |                                      | Output Data                            |
|--------------------------------|--------------------------------------|--|
| Frequency<br>Range (kHz)<br>10 | Primary Coil<br>V <sub>RMS</sub> (V) | Secondary Coil<br>V <sub>RMS</sub> (V) |
| 20<br>30<br>40                 | 3.535                                | 1.14 H <sub>2</sub> SO4                |
| 50<br>60                       |                                      | 1.20 H <sub>2</sub> SO4                |

Ranges of Frequency and Voltage Input at Different H<sub>2</sub>SO<sub>4</sub> Concentrations **9** 



The pH was measured to represent changes in concentration at the electrolyte during cell's cycling.

pH at Different  $H_2SO_4$  Specific Gravity (SG) vs. Time



| H₂SO₄ | рН    | Stdv |
|-------|-------|------|
| 1.07  | -0.40 | 0.05 |
| 1.14  | -0.82 | 0.07 |
| 1.20  | -1.32 | 0.05 |
| 1.33  | -1.67 | 0.04 |

pH Measurement for Different H<sub>2</sub>SO<sub>4</sub> Concentrations

pH Measurements for 1.07-1.33 H<sub>2</sub>SO<sub>4</sub> Concentrations

pH Measurements for 1.07-1.33  $\rm H_2SO_4$  Concentrations

# As the Sulfuric acid concentration increases the pH decreases due to donation of H<sup>+</sup> to water.

#### At the cell level, during discharge sulfuric acid is consumed and water is produced.

# **Experimental Approach**





Introduction

Prepare Electrolyte at Different Concentrations

| Preparation of Solutions |                |             |  |
|--------------------------|----------------|-------------|--|
| $(H_2SO_4)$              | $H_2SO_4$ (ml) | $H_2O$ (ml) |  |
| 1.07                     | 20ml           | 80ml        |  |
| 1.14                     | 40ml           | 60ml        |  |
| 1.20                     | 60ml           | 40ml        |  |
| 1.33                     | 80ml           | 20ml        |  |

Preparation of 10%-40% H<sub>2</sub>SO<sub>4</sub> Solutions



Objectives

pH Measurement at the Electrolyte Level

| pH Theoretical              |  |
|-----------------------------|--|
| Value                       |  |
| -0.337                      |  |
| -0.667                      |  |
| -0.872                      |  |
| -1.026                      |  |
| r 10%-40% H <sub>2</sub> SO | 4  |
| trations                    |  |
|                             | PH Theoretical<br>Value<br>-0.337<br>-0.667<br>-0.872<br>-1.026<br>10%-40% H <sub>2</sub> O,<br>trations |



Methodology

Coupled Coils Measurements at Different Electrolyte Concentrations

Coupled Coils Measurements at the Cell Lower Electrolyte Level

| Input Data               |                                      | Output Data                            |
|--------------------------|--------------------------------------|--|
| Frequency<br>Range (kHz) | Primary Coil<br>V <sub>RMS</sub> (V) | Secondary Coil<br>V <sub>RMS</sub> (V) |
| 10                       |                                      | 1 07 H SO                              |
| 20                       |                                      | 1.07 H <sub>2</sub> OO <sub>4</sub>    |
| 30                       | 0525                                 | 1 14 H <sub>2</sub> SO                 |
| 40                       | 0.5-3.5                              |  |
| 50                       |                                      | 1.20 H₂SO₄                             |
| 60                       |                                      | 2 4                                    |
| 70                       |                                      | 1.33 H₂SO₄                             |

Ranges of Frequency and Voltage Input at Different H<sub>2</sub>SO<sub>4</sub> Concentrations

### Characterization of Frequency and Amplitude Input Values



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### SCOV Variation with Coil Separation





Note changes in output voltage as distance between coils increase

# SCOV at Different H<sub>2</sub>SO<sub>4</sub> Concentrations





# **Experimental Approach**





Introduction

Prepare Electrolyte at Different Concentrations

| Preparation of Solutions |                |                       |  |
|--------------------------|----------------|-----------------------|--|
| $(H_2SO_4)$              | $H_2SO_4$ (ml) | H <sub>2</sub> O (ml) |  |
| 1.07                     | 25ml           | 75ml                  |  |
| 1.14                     | 50ml           | 50ml                  |  |
| 1.20                     | 75ml           | 25ml                  |  |
| 1.33                     | 100ml          | 0ml                   |  |

Preparation of 10%-40% H<sub>2</sub>SO<sub>4</sub> Solutions



Objectives

pH Measurement at the Electrolyte Level

| $H_2SO_4$     | pH Theoretical |
|---------------|----------------|
| Concentration | Value          |
| 1.07          | -0.337         |
| 1.14          | -0.667         |
| 1.20          | -0.872         |
| 1.33          | -1.026         |
|               |                |

Theoretical pH for 10%-40% H<sub>2</sub>SO<sub>4</sub> Concentrations



Methodology

Coupled Coils Measurements at Different Electrolyte Concentrations



Coupled Coils Measurements at the Cell Lower Electrolyte Level

| Input Data               |                                      | Output Data                            |
|--------------------------|--------------------------------------|--|
| Frequency<br>Range (kHz) | Primary Coil<br>V <sub>RMS</sub> (V) | Secondary Coil<br>V <sub>RMS</sub> (V) |
| 30-35                    | 3.535                                | 1.33H <sub>2</sub> SO <sub>4</sub>     |

Ranges of Frequency and Voltage Input at Different  $H_2SO_4$  Concentrations

### SCOV During Discharge (Lower-Left Section of Electrolyte)





#### The SCOV gradually increases as the electrolyte concentration decreases



### SCOV During Charge (Lower-Left Section of Electrolyte)



0.85 0.85



Charge Curve vs. SCOV

Primary and Secondary Coils Positioned at the Left Lower Section in the Cell-Electrolyte Only



Results from Experimental Approach of Output Voltage at 33kHz Input Voltage During Charge

## Takeaways from Preliminary Experimental Results



Introduction

Objectives Methodology

Conclusions

#### pH Electrolyte Measurements

- pH measurements were conducted at various sulfuric acid concentrations ranging from 1.07 to 1.33 specific gravity.
- The data obtained consistently and reproducibly showed a measurable relationship between these concentrations and the corresponding pH levels, particularly at very low pH values.

## Takeaways from Preliminary Experimental Results



#### Introduction

Objectives Methodology

Conclusions

#### Secondary Coil Output Voltage (SCOV) at Lower Electrolyte Level

- The optimal AC input frequency that maximizes the induced magnetic field response lies in the range of 30kHz-33kHz, depending on the physical properties of the magnetic field inductors (air core solenoid coils).
- A clear correlation between the output voltage resulting from the interaction of the induced magnetic field and changes in the electrolyte concentration was observed.
- If we increase the input voltage at the primary coil then the magnetic field excitation increases and the voltage at the secondary coil also correspondingly increases.

## Takeaways from Preliminary Experimental Results



Introduction

Objectives Methodology

Conclusions

#### Secondary Coil Output Voltage (SCOV) at Electrolyte Level in a Full Cell

- The magnetic field decreases during charging and increases during discharge
- The H+ proton concentration in the electrolyte and the SCOV both vary with the specific gravity during battery cycling

These findings provide a foundation for the development of an efficient and effective battery monitoring system, that has the potential to significantly improve the reliability and lifespan of flooded LABs.

# **Objectives of this Research**



#### Objective 1:



Objective 1.2: Secondary Coil Output Voltage (SCOV) Variations at individual Electrolytes



Objective 1.3: Secondary Coil Output Voltage (SCOV) Variations with Coil Separation at Electrolyte Level in a Full Cell during cycling



The magnetic field will be mapping using an array of magnetoresistive sensors for 6 cells, 200 cycles

Compare with magnetic imaging scans to identify correlations



- Map elemental composition of the electrodes
- Perform energy dispersive x-ray analysis

#### Objective 3:

Simulate the magnetic field mapping of flooded lead acid cells using finite element modeling in the COMSOL Multiphysics environment.



3D Lead Acid Cell Simulation-Adapted from Dr. Parmender Singh Model for Li-ion Electrochemistry.

The simulated results will be compared to the experimental findings obtained from objectives 1 and 2.

## **O2:** Proof of Concept for Magnetoresistive Sensors





 $B_m = 1.5 \times 10^{-5} T \text{ or } 0.15 G$ 

Use of permalloy, an alloy of nickel and iron whose resistance changes proportionally when presented with a magnetic field. Via analog circuitry, the resistance is then converted to a voltage. The voltage generated is directly proportional to the original current.

## Experimental Setup with Sensors





3 Cells-60 Cycles and 3 Cells-Pristine | Specific Gravities: 1.07-1.30

#### Place Magnetoresistors at the Cell's Electrolyte Level



# **Objectives of this Research**



#### Objective 1:



Objective 1.2: Secondary Coil Output Voltage (SCOV) Variations at individual Electrolytes



Objective 1.3: Secondary Coil Output Voltage (SCOV) Variations with Coil Separation at Electrolyte Level in a Full Cell during cycling

#### 

The magnetic field will be mapping using an array of magnetoresistive sensors for 6 cells, 200 times

Compare with magnetic imaging scans to identify correlations



- Map elemental composition of the electrodes
- Perform energy dispersive x-ray analysis

#### Objective 3:

Simulate the magnetic field mapping of flooded lead acid cells using finite element modeling in the COMSOL Multiphysics environment.



3D Lead Acid Cell Simulation-Adapted from Dr. Parmender Singh Model for Li-ion Electrochemistry.

The simulated results will be compared to the experimental findings obtained from objectives 1 and 2.



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## Thank You!





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# Appendix

# Magnetic Susceptibility Introduction

#### Introduction and Background

- Magnetic susceptibility  $(\chi_m)$  indicates the ability of a material to be magnetized in response to an applied magnetic field.
- It provides a measure of how a material will react when placed in a magnetic field. ٠

Magnetic field  $B_0$ It is calculated as the ratio of the magnetization (M) of the material to the applied magnetic field strength (H)  $\chi_{\rm m} = \frac{M}{H}$ 

Depending on the atomic composition of a substance, it can have a diamagnetic or ۲ paramagnetic response.  $\chi_m < 0$ 



 $\chi_m > 0$ 

Alignment with the

magnetic field

Paramagnetic





Alignment against the magnetic field

Diamagnetic



# Air Core Solenoid Magnetic Field

#### Introduction and Background

The magnetic field strength, B, inside the center of a solenoid is calculated using the equation:

> $L = \frac{N^2 \mu A}{I}$  $\mu = \mu_I \mu_0$  $B = 7.074 \times 10^{-6} T$

Where,

L= Inductance of coil (H) N=Number of turns in the coil µ=Permeability of core material  $\mu_{I}$ =Relative permeability, dimensionless ( $\mu_{0}$ =1 for air) =1.26x10<sup>-6</sup> T m/At permeability of free space  $\mu_0$ A=Area of coil in square meters= $\pi r^2$  (See figure 6) l=Average length of coil in meters

A changing magnetic field, induces an electric field, which results in an induced voltage response



Fig. 8 Air Core Solenoid Inductor







The magnetic field resulting from a typical lead acid cell is given by the Biot-Savart law, which measures the magnetic field generated by an electric current.

The equation is as follows:

$$B_m = \frac{\mu_0 I}{2\pi r}$$

where,

- B<sub>m</sub> Is magnitude of magnetic field measured by a sensor
- $\mu_0$  Is the permeability of free space
- I Is the current
- r Is the perpendicular distance from the sensor to the coil