# Towards Cognitive Digital Twin for Battery Analytics

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### Outline

Battery Management

Al-based Battery Management

Cognitive Digital Twin

Use Cases

# **Battery Management**

# Traditional Battery Management System

Battery Management System (**BMS**) – A Battery Doctor:

- Electronic system that manages a rechargeable battery.
- Protection & prevention of the system from damage.
- Increase of battery life.
- Maintenance of the battery system in accurate and reliable state.

#### However, traditional BMS meets several challenges:

- *Limited data collection*: only current and voltage for charging and discharging.
- *Missing important features*: require probing batteries in action, detecting subtle signals.

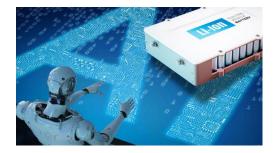


- *Complicated battery dynamics*: need more accurate & comprehensive analytic method.
- *Increasing concern on safety and efficiency*: need explainability & real-time reaction.

#### AI and Data-driven approach are the keys to unlock battery technology

# Al-based Battery Management

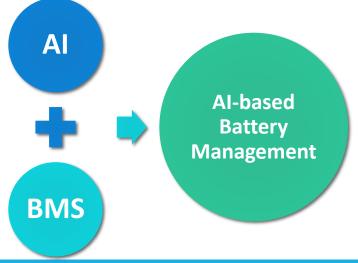
# Analytics and Al in Battery Industry



Artificial intelligence (AI): the 4<sup>th</sup> industrial revolution enabled by:

- Data: internet-of-things (IoT).
- Communication: **5G** and 6G.
- Computation: high-performance computing and **GPU**-powered edge device.
- Algorithms: simulating human intelligence.

Widely adopted in various sectors: manufacturing, transportation, etc.



**Battery industry** definitely is not falling behind.

- AI-based battery gauge for state-of-charge (SOC).
- Al to predict state-of-health (SOH) in Nature.
- Al to group the **used batteries** into diff. categories.
- AI for battery-enabled **demand response**.

# Challenges for Al-based Battery Management

**Challenges** to be addressed despite the vast research effort.

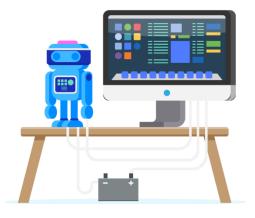
#### Data scarcity

- **High-cost**, i.e., 1 battery for 1 cycle life data.
- Numerous **battery types**. Cannot capture all.
- **Privacy**, i.e., battery status of a private car.
- However, many AI algos need **big data** to survive.

#### **Risk-averse mindset**

- Most existing AI algorithms are **black-box** in nature.
- No **trust** -> no adoption. **Understand** -> trust.
- Rest assured about the limits, i.e., crossing the line?
- Government **regulations**, i.e., EU's GDPR.

Overall, far from real-world adoption for battery.





# **Cognitive Digital Twin**

## Cognitive Digital Twin for Battery Management

Physical-based digital twin. (1st gen)

- Physical laws, i.e., fluid dynamics, electrical circuit.
- Decades of **effort**. Huge **cost**. Poorly generalized.

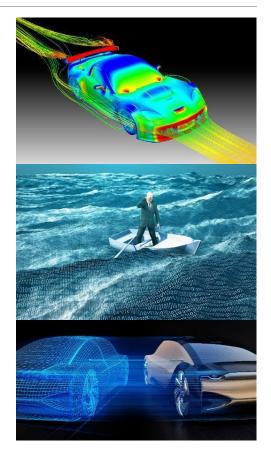
Data-driven digital twin. (2<sup>nd</sup> gen)

- Machine learning, approximation from data.
- Highly **reliant** on **big data**. But often insufficient.

Overall, virtual replica with **no intelligence**.

#### AloT + digital twin. (3<sup>rd</sup> gen)

- Far beyond a virtual replica of a real-world entity.
- AIoT: AI-enabled IoT for 3-tier intelligence:
  - Descriptive intelligence for what has happened.
  - Prescriptive intelligence for **what do we do**.
  - Predictive intelligence for what will happen.



# Use Cases

## 1. SOH prediction based on AI: Preliminary Results

State-of-the-art: Nature Energy 2019 work for SOH prediction.

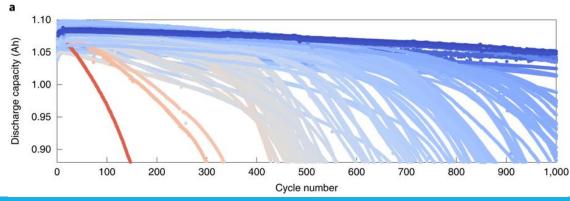
- Linear Regression, 85-87% accuracy.
- Variance model: single feature input.
- Full model: 9-feature input.

Our Al-based Approaches.

- Shallow neural network. Able to win.
- Deep Learning. To be explored.

Huge potential with AI + Digital Twin.

	Nat. Energy Liner Reg.	Our Work Neural Net.
Variance Model	85.3%	86.4%
Full Model	85.9%	88.4%



# 2. Use Cases of Digital Twin in Battery Management

TWAICE battery simulation models for lithium-ion batteries.

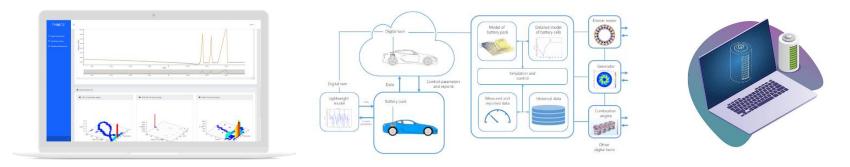
- Speed up system design and replace lengthy testing cycles.
- SOH, Electrical-thermal, remaining storable energy, accessible power, etc.

**COMSOL** digital twin of a battery pack.

- Temperature, SOC, impedance, current versus voltage curves, etc.
- Multiphysics model in COMSOL to alleviate the data reliance.

ION Energy: digital twin to improve Lithium battery life.

- AloT to predict life, overall performance, and critical issues.
- Prevent breakdowns. Insights, recommendations, and tools for optimization.



## Collaboration

To implement the cogitative digital twin in real battery management system needs the effort from multiple agencies.

- Enrich the domain knowledge from multiple disciplines.
- Increase creativity and out-of-the-box thinking.



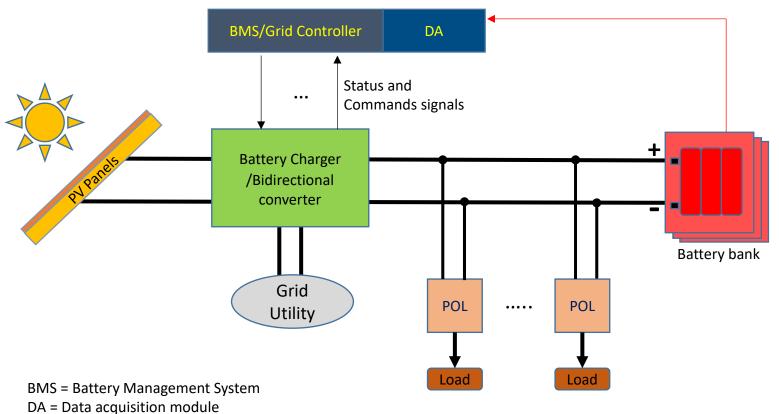
### Thank You!

Intelligent Embedded Platform for Battery Analytics

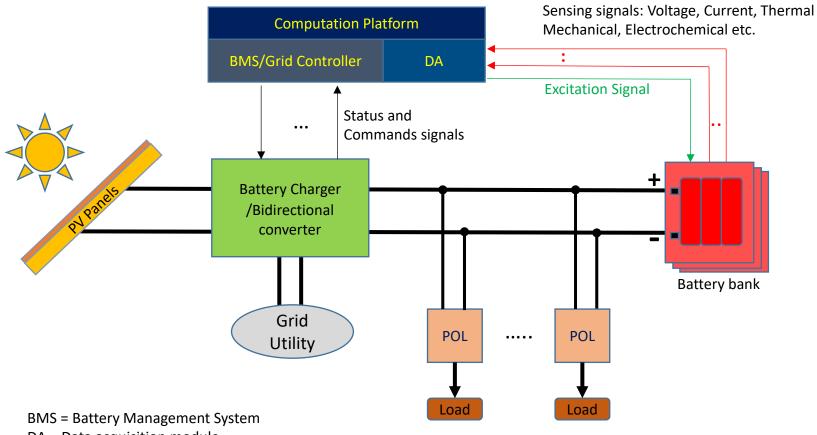
(Nicholas Vun)

#### **Conventional Battery Management System**

Sensing signals: Voltage, Current, Thermal

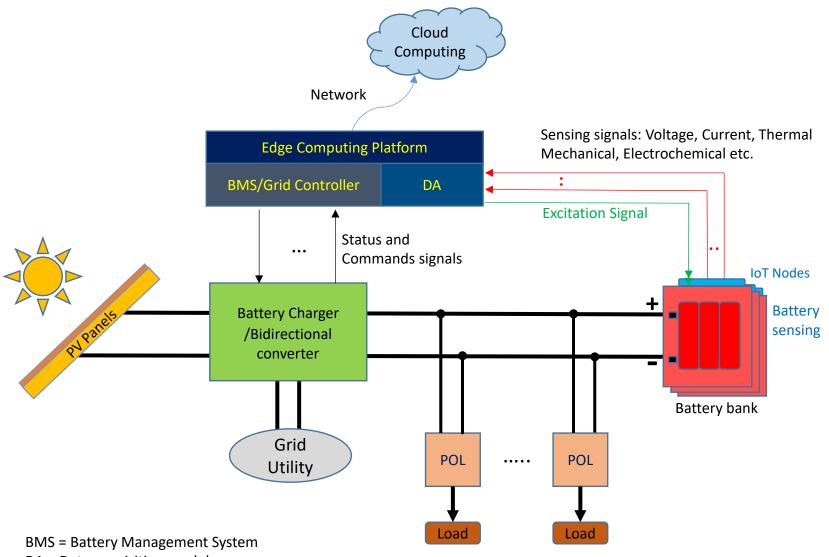


#### **Embedded Platform for Battery Analytics**



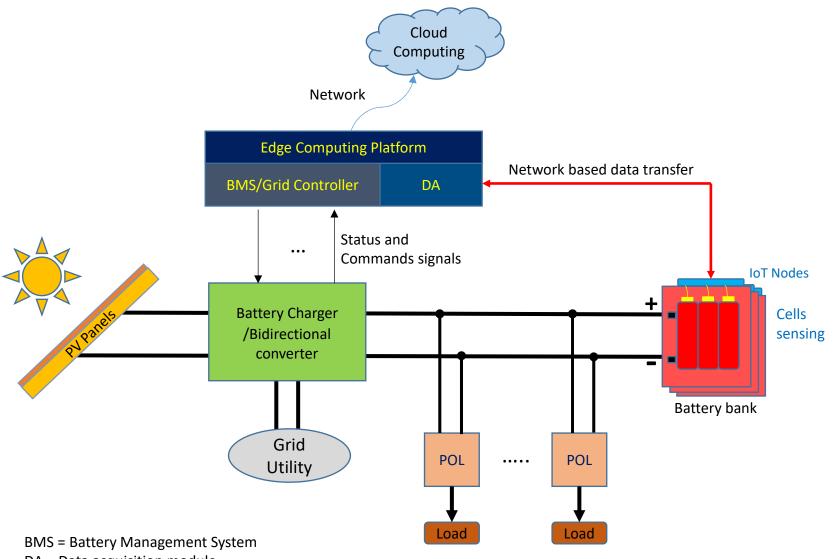
DA = Data acquisition module

#### An Intelligent Embedded Platform for Battery Analytics



DA = Data acquisition module

#### An Intelligent Embedded Platform for Battery Analytics



DA = Data acquisition module





Institute of Materials Research and Engineering

### OPERANDO BATTERY MONITORING AND SENSING FOR BATTERY ANALYTICS

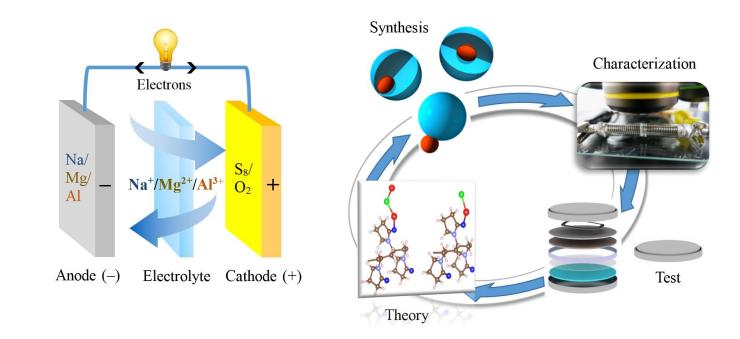
Zhi Wei Seh

Senior Scientist I

Institute of Materials Research and Engineering Agency for Science, Technology and Research (A\*STAR)

http://www.zwseh.com

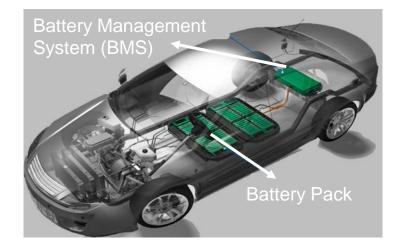
#### **Next-Generation Batteries**

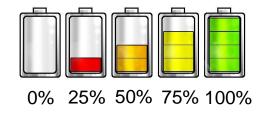


M.-F. Ng, J. Zhao, Q. Yan\*, G. J. Conduit\*, <u>Z. W. Seh\*</u>, *Nat. Mach. Intell.* 2020, 2, 161-170 A. D. Handoko, F. Wei, Jenndy, B. S. Yeo, <u>Z. W. Seh\*</u>, *Nat. Catal.* 2018, *1*, 922-934 <u>Z. W. Seh</u>, J. Kibsgaard, C. F. Dickens, I. Chorkendorff, J. K. Norskov, T. F. Jaramillo\*, *Science* 2017, *355*, eaad4998

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Operando/onboard battery monitoring and sensing is important:

- Determine state of charge
- Determine state of health
- Predict remaining useful life
- Identify catastrophic safety issues
- Enable safe and fast charging
- Optimize battery capacity

Current BMS can measure:

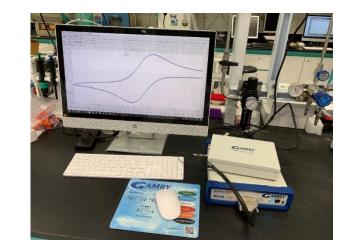
- Current
- Voltage
- Surface temperature

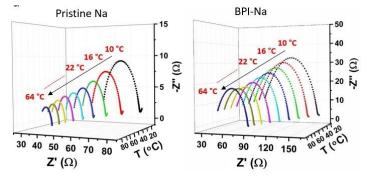
What's next in battery analytics?

\*



#### **Electrochemical Impedance Spectroscopy (EIS)**

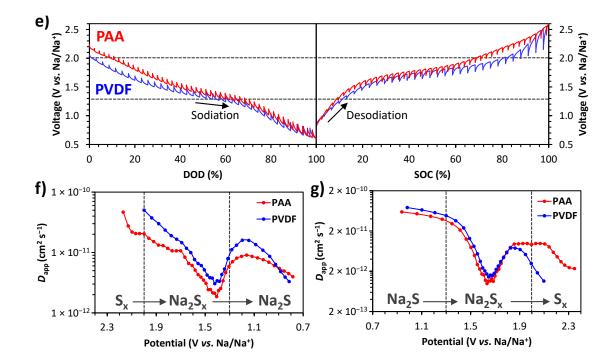




- EIS can give valuable information on internal cell resistance using sinusoidal AC excitation signal
- High internal resistance denotes poor state of health and end of life
- Temperature-dependent EIS can determine activation energy and kinetics for charge transfer

V. Kumar, Y. Wang, A. Y. S. Eng, M.-F. Ng, <u>Z. W. Seh\*</u>, *Cell Rep. Phys. Sci.* 2020, *1*, 100044
V. Kumar, A. Y. S. Eng, Y. Wang, D.-T. Nguyen, M.-F. Ng, <u>Z. W. Seh\*</u>, *Energy Storage Mater.* 2020, *29*, 1-8

#### **Galvanostatic Intermittent Titration Technique (GITT)**



GITT uses current pulses and relaxation times to determine lithium ion diffusion coefficient as a function of battery state of charge

(1001) 1001)

\*

#### **High Precision Coulometry**



Courtesy of Novonix





- It is important to have high precision and high accuracy coulometry when evaluating batteries
- Battery cycler can measure coulombic efficiency with a precision of 20 ppm and accuracy of 50 ppm
- High precision coulometry can enable reliable prediction of battery lifetime within short time period

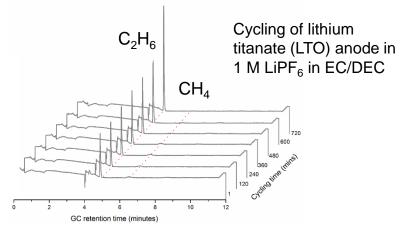
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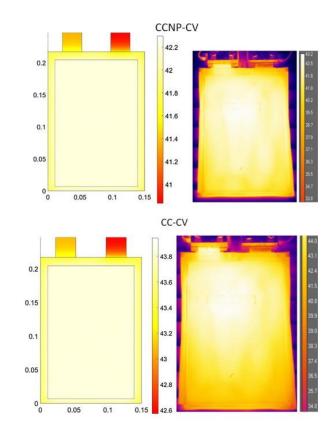
#### Gas Chromatography (GC)

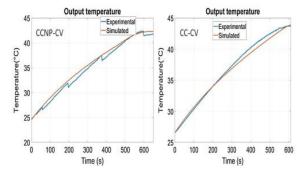




- GC can measure unwanted gas evolution from electrolyte decomposition during battery cycling
- Flame ionization detector and thermal conductivity detector can perform trace analysis down to ppb levels



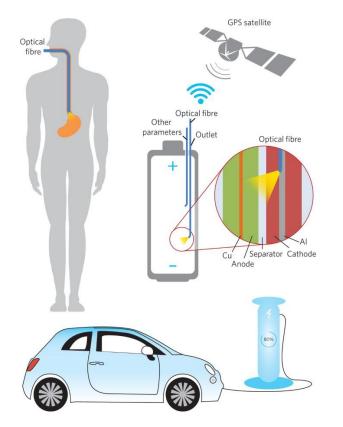




Appl. Therm. Eng. 128, 1282–1296 (2018)

- Thermocouples and infrared cameras can be used to measure surface temperature of batteries
- However, surface temperature can differ greatly from internal temperature, which is more relevant to safety

#### **Future Prospects and Outlook**



Nature Materials 16, 45–56 (2017)

- Implantable smart sensors in batteries in the future?
- Monitor internal processes in batteries during operation, e.g. internal temperature, pressure, strain, etc
- Can determine state of charge and health of batteries
- Can communicate with outside world
- Ultimate goal: Incorporate operando battery sensors and data into a smart BMS for the future





### **THANK YOU**

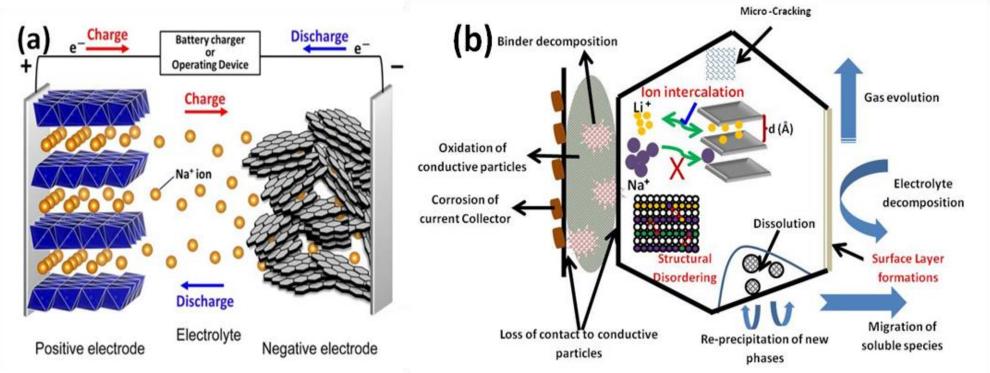
www.a-star.edu.sg

# In-situ and ex-situ materials characterization for explainable machine learning

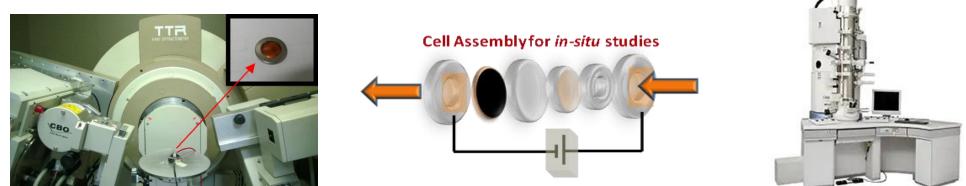
Yan Qingyu School of Materials Science and Engineering Nanyang Technological University Singapore



### Materials changes and electrochemical process in LIBs

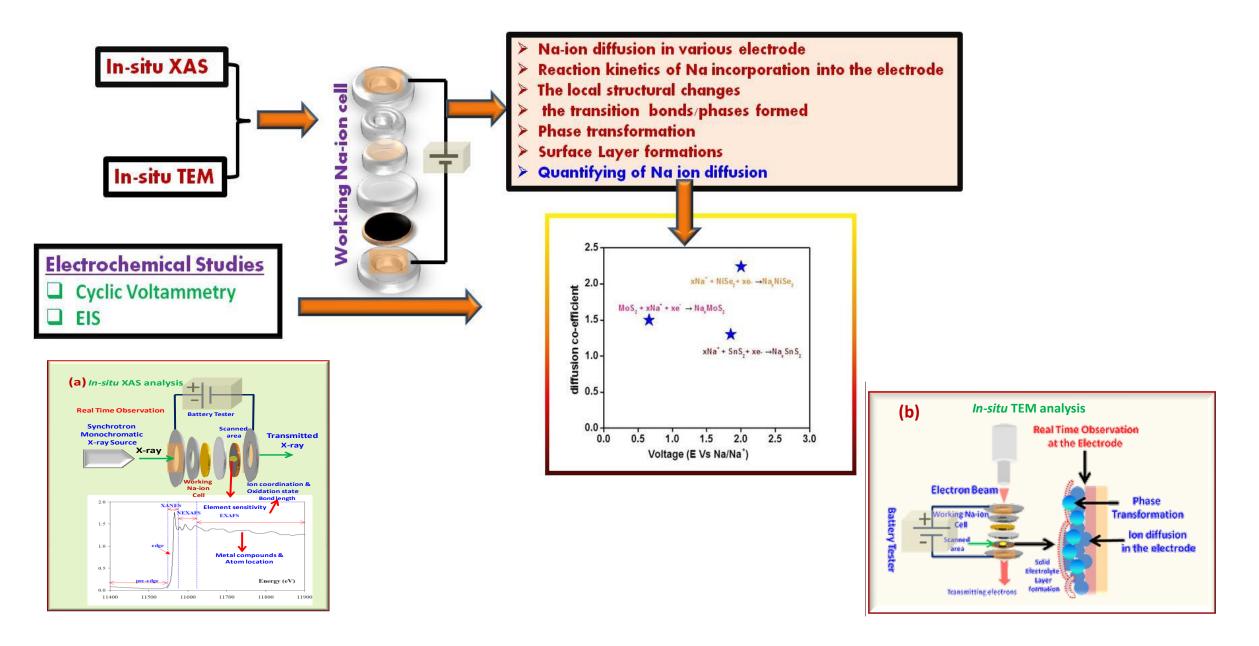


Various materials changes and electrochemical process taken place in Li ion batteries and affecting the performance

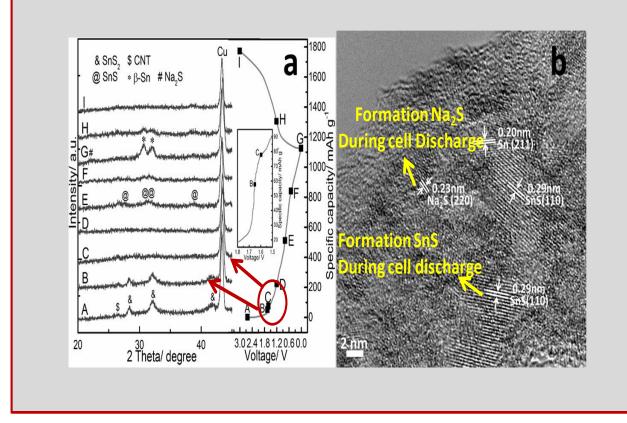


In-situ cells + characterization tools = real time information on material components during battery operation

### Working principle of in-situ ex-situ materials characterization



# Characterization to generate information on monitoring the change of battery components



### (1) spectroscopy tools

Phase, expansion, electrode dissolution, structure disordering, valence, SEI growth, SEI decomposition, binder decomposition

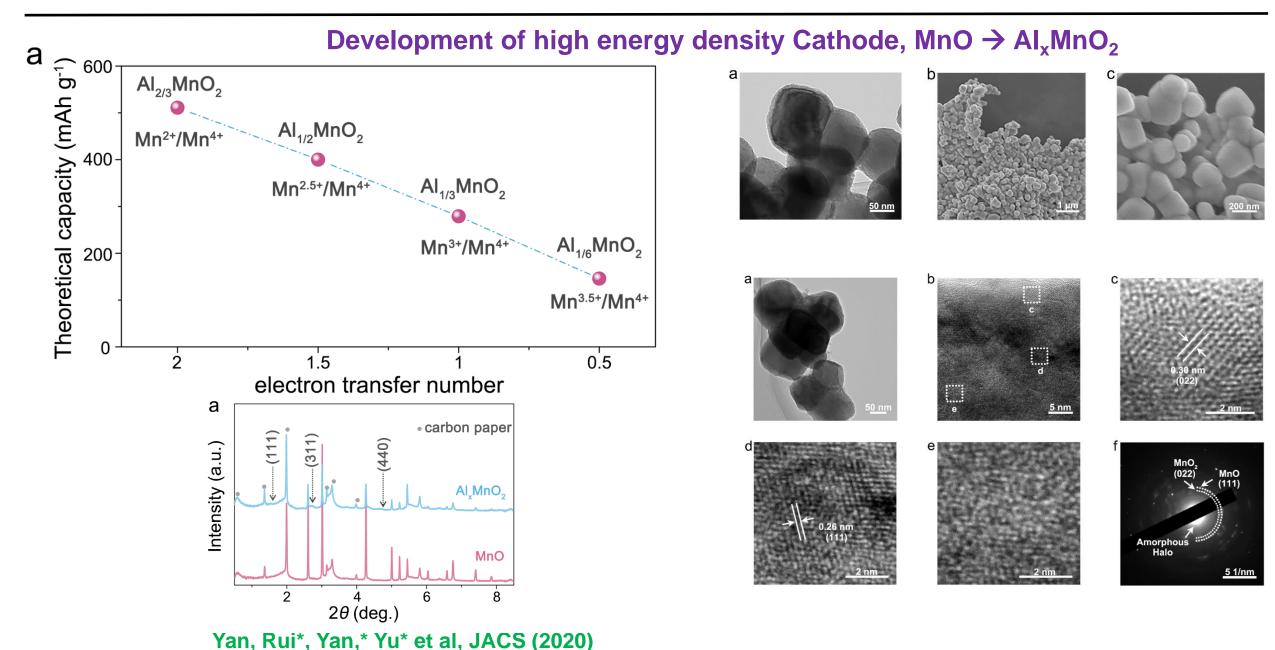
### (2) microscopy

Graphite exfoliation, electrode particle cracking, Li plating/dendrite

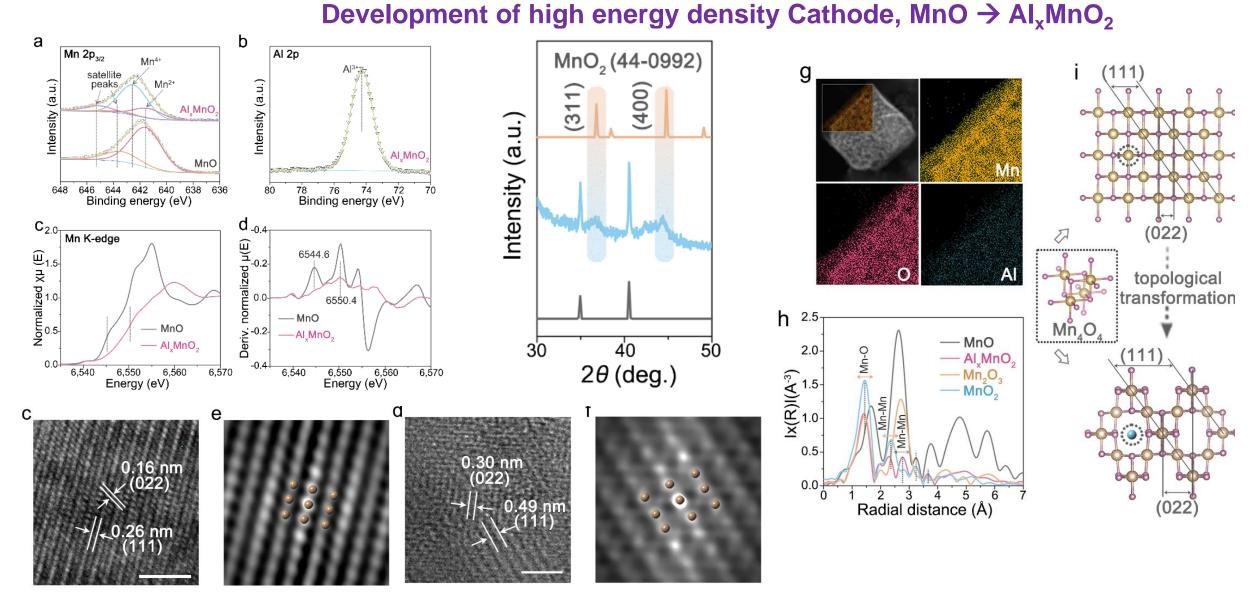
Our studies on the phase change, structural changes of SnS<sub>2</sub> for battery electrode during charge discharge cycling

Sun and Yan\*, ACS NANO 9 (11), (2015), p11371-11381

### High Energy Density and Stable Rechargeable Aqueous AI ion Battery

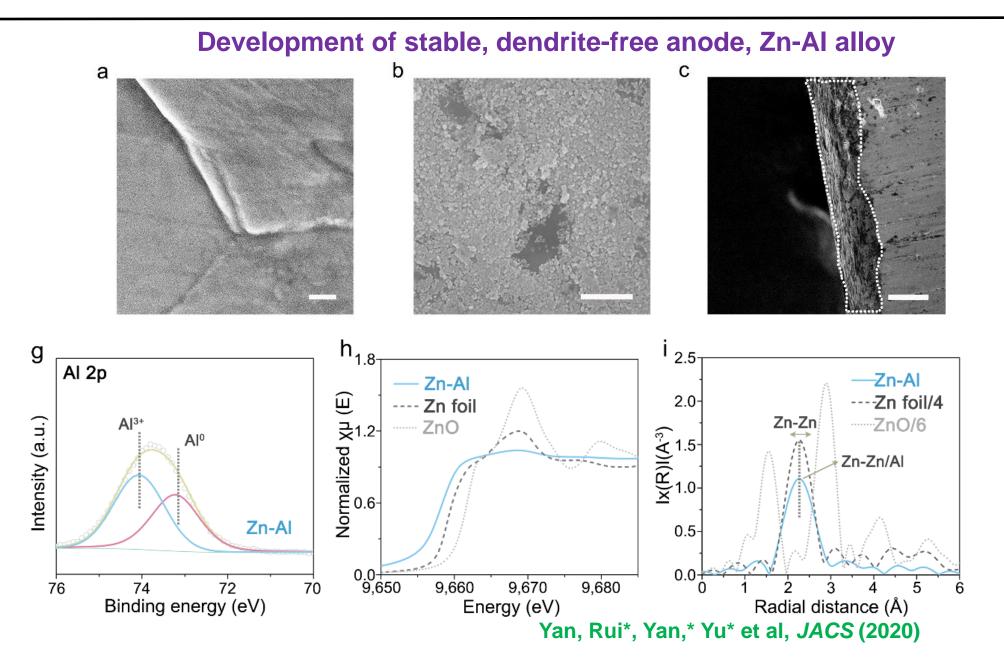


### High Energy Density and Stable Rechargeable Aqueous AI ion Battery

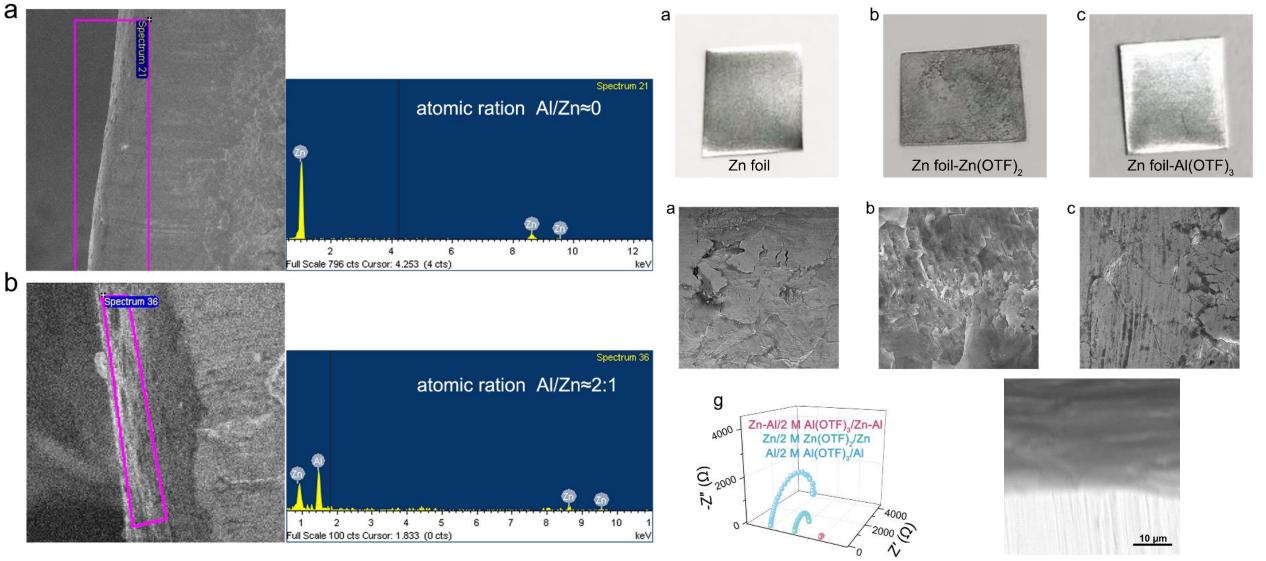


Yan, Rui\*, Yan,\* Yu\* et al, JACS (2020)

### High Energy Density and Stable Rechargeable Aqueous AI ion Battery

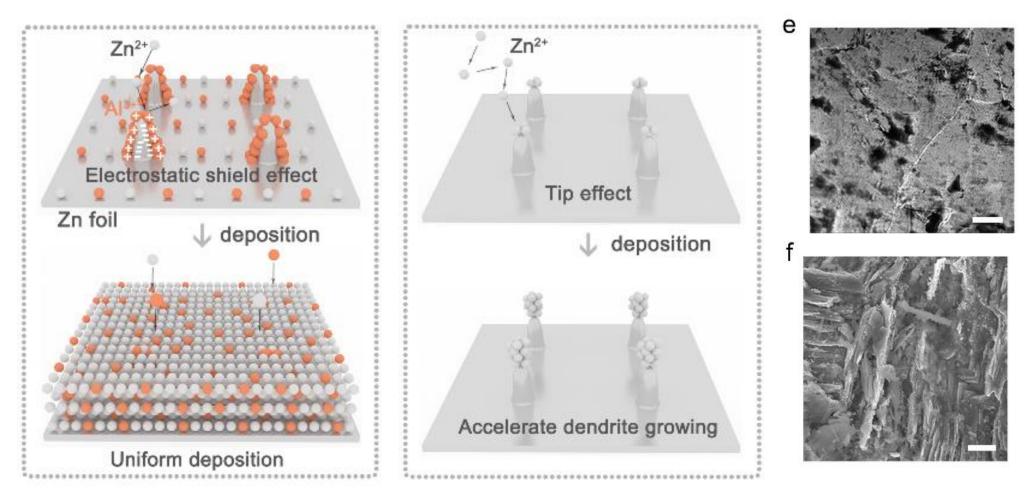


#### **Development of stable, dendrite-free anode, Zn-Al alloy**



Yan, Rui\*, Yan,\* Yu\* et al, JACS (2020)

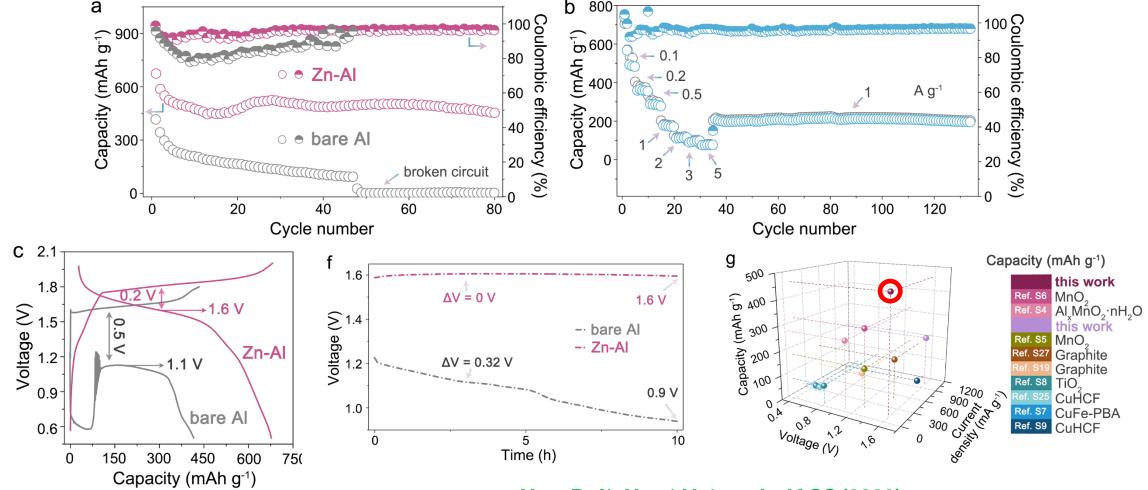
Symmetric cells comparison, inhibition of dendrite and side reaction



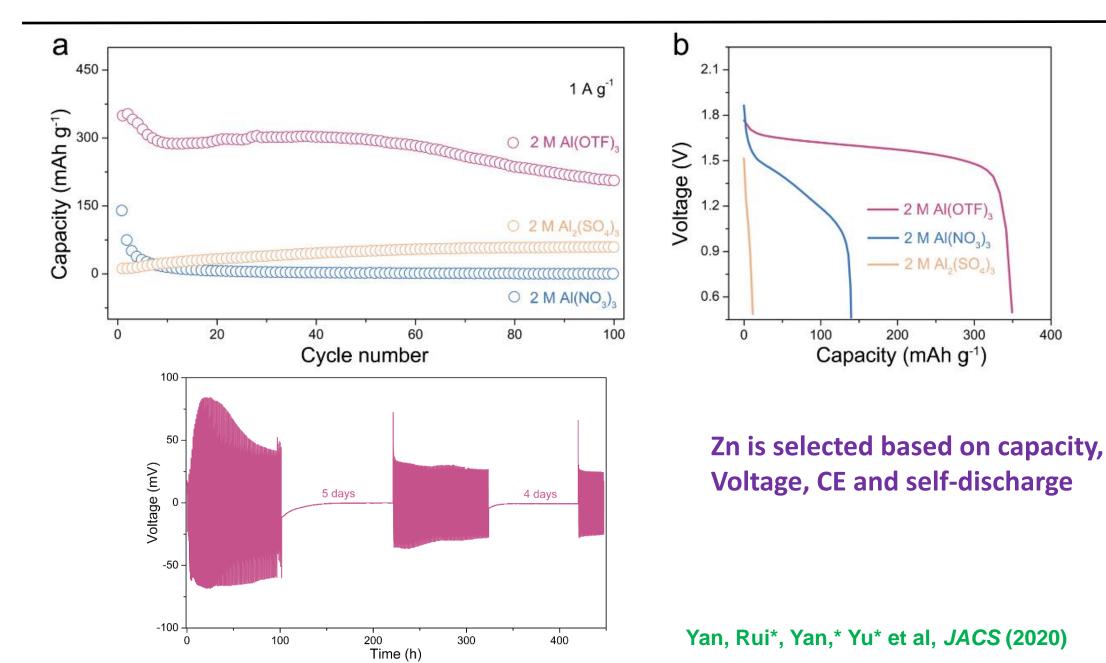
Zn-Al alloy after plating 100 cycles

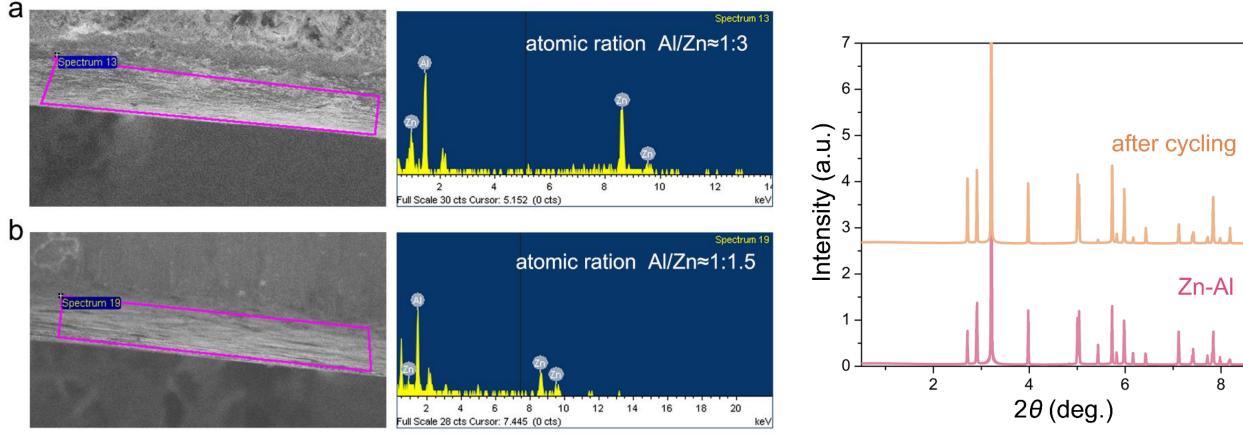
Zn alloy after plating 100 cycles

Full Cell battery performance: 460 mAh/g with Columbic efficiency ~98% upon cycling (highest achieved so far in the world), high discharge voltage (1.6 V), stable cycling, no dendrite formation, no side reaction, good rate (fast charging) performance, long shelf life.



Yan, Rui\*, Yan,\* Yu\* et al, *JACS* (2020)





SEM and EDS images of Zn-Al anode at different states after 10 cycles. (a) Discharge. (b) Charge.

High energy synchrotron XRD patterns of Zn-Al anodes before and after cycling. No observable phase change

Yan, Rui\*, Yan,\* Yu\* et al, JACS (2020)





Singapore Institute of Manufacturing



# INNOVATION FACTORY **SEP 2020**

#### Mission

To support SMEs from ideation to design and engineering stage, and migrate them to product owners in order to venture into higher value markets.

#### Vision

The one-stop design and solution centre for Singapore SMEs.

# **Objectives and Intent of the Innovation Factory**

#### **Objectives**

- To plug the current gaps in companies looking to develop new products
- Catalyse innovative design and Scale up to Pilot production

#### Target Group

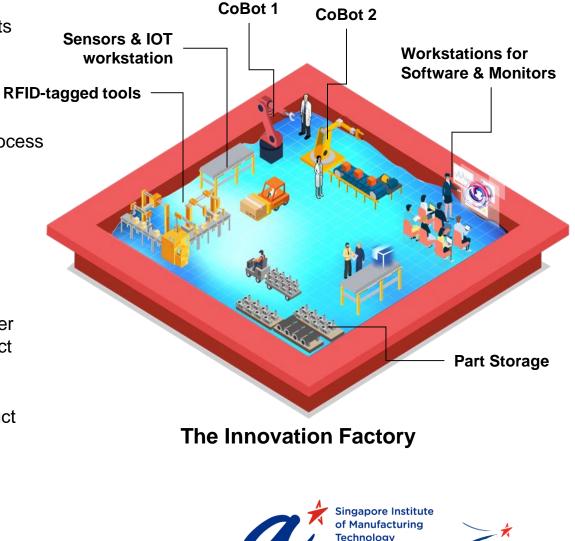
- Product and Equipment Distributors
- Companies curated via Operational & Technology Roadmap (OTR) process
- PE company aspiring to be an Original Device Manufacturer (ODM)
- 2<sup>nd</sup> generation SME owners who plan to branch into new areas
- Lifestyle, Retail and consumer products companies

#### Value Capture

- Enable local SMEs to move up the value chain and broaden business
   opportunities
- Migrate SMEs from component / module manufacturer to product owner
- Form network of hardware & software companies to co-develop product

#### Differentiators

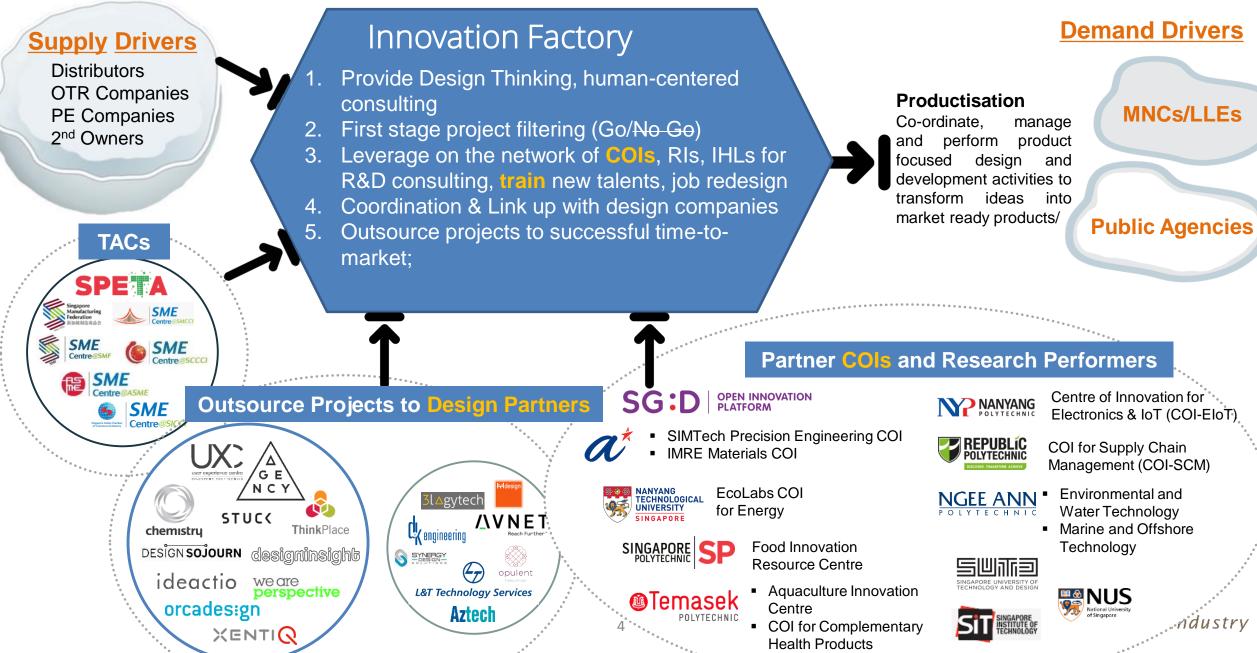
 Enable SMEs to 'Fish' (from Ideation to Pilot Production) via the Product Development journeys

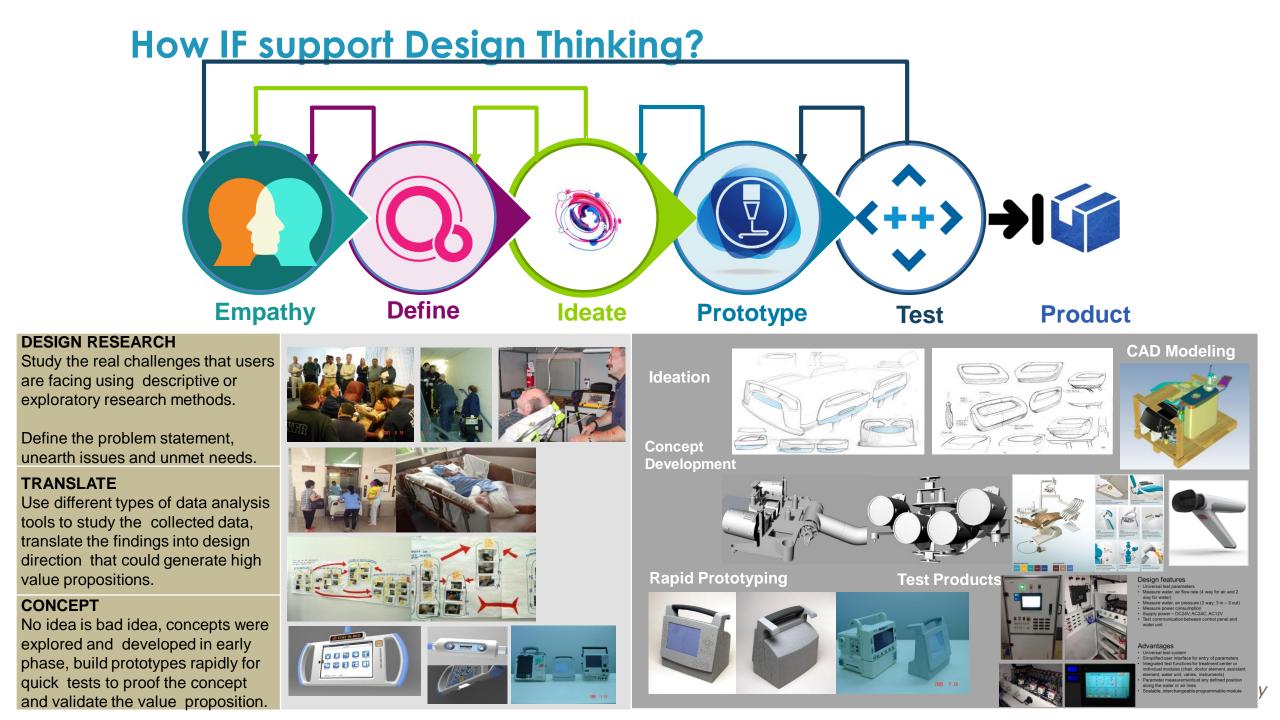


### SIMTech Innovation Factory – The IDEA Model

Target Companies	Stage 1 DEATION	Stage 2 DESIGN	Stage 3 ENGINEERING	Stage 4 APPLICATION
Precision Engineering	Ideation Journey Program	Design Journey	Engineering Journey Program	Scale-up to Pilot production program
MedTech	<ul> <li>Creating an ecosystem with application of <b>Design Thinking</b> methodologies</li> <li>Exchange of ideas between demand and supply drivers</li> </ul>	Program Outsourced projects to Design Companies: • Advanced Product & Engineering	Access pool of experts from RIs, IHLs, COIs: • Robotics • Additive Manufacturing	<ul> <li>Assist SMEs to set up Pilot Production line</li> <li>Model Factory Digital Solutioning</li> </ul>
Distributors	<ul> <li>Design Bootcamp</li> <li>Focus Areas: <ul> <li>MedTech</li> <li>PE and Industrial Equipment</li> <li>Lifestyle, Consumer and</li> </ul> </li> </ul>	<ul> <li>design</li> <li>New Product Development</li> <li>Embedded Systems</li> <li>Network of Designers &amp; Consultants</li> </ul>	<ul> <li>AI, Sensors &amp; IoT</li> <li>Vision &amp; Inspection</li> <li>Advanced Materials</li> <li>AR, VR, Simulation</li> </ul>	<ul> <li>Product / Module Performance Validation and Assessment</li> </ul>
A*STAR OTR	Retail		Image: State of the state	Codel factory@SIMTech MODEL FACTORY @ ARTC
DESIGN THINKING	Start Design Thinking early (core competency) Innovation Labs to	address today's Gap	POLYTECHNIC POLYTECHNIC POLYTECHNIC POLYTECHNIC POLYTECHNIC NGEE ANN POLYTECHNIC NGEE ANN POLYTECHNIC NGEE ANN POLYTECHNIC NGEE ANN POLYTECHNIC NGEE ANN POLYTECHNIC	, IHLs and A*STAR RIs

# **Collaboration with COIs and the Larger Ecosystem**





# **Innovation Factory Consultancy in Design Thinking**



# **Building Design Capabilities to narrow Market Gaps**



#### Stage 2 DESIGN

# Innovation Factory Collaboration with Design Houses/RIs/IHLs/COIs

**Scope of Design Services** 

NPD	Scope	<b>Design Activities</b>	Tools and Deliverables
Transform the finalized design concept into design for manufacturability, cost- effective and reliable product throughout the established product development process.	General	<ul> <li>Requirement Management</li> <li>Defect Tracking</li> <li>GTM strategy</li> <li>Test Management</li> <li>Document Control</li> <li>Project Management</li> </ul>	windchill windchill
Proposed designs will be reviewed in an iterative manner at every stage to ensure technical problems are solved	1.0 Industrial Design	<ul> <li>As previous slides on Phase 1</li> </ul>	<ul> <li>Rhino 3D</li> <li>Adobe Creative Cloud  KeyShot  KeyVR</li> <li>Luxion KeyShot 3D Photorealistic Rendering</li> </ul>
without compromise the design requirements. Continual refinement of ideation	1.1 Electrical Design	<ul> <li>8/16/32 bit processors</li> <li>Motor controls, robotics</li> <li>Analog and Digital</li> </ul>	<ul> <li>Linear Tech LTSpice</li> <li>Keil</li> <li>STMCube</li> <li>Code Composer</li> <li>Linear Tech LTSpice</li> <li>Uspice</li> <li>STM32 Cube</li> </ul>
sketches, detail design drawing, 3D CAD modeling and rapid prototyping within the planned project timeline will transform the fuzzy frontend and early thoughts into a high quality and attractive product.	1.2 Schematics and PCB Design	<ul> <li>Power mgt.</li> <li>Audio and video</li> <li>PCB Design</li> <li>Simulation</li> <li>Programmable Logic 8</li> </ul>	<ul> <li>Arduino</li> <li>Mentor Graphics</li> <li>Altium Designer</li> <li>Autodesk Eagle</li> <li>DDS Circuit Works, Part Libraries</li> </ul>

# Innovation Factory Collaboration with Design Houses/RIs/IHLs/COIs

#### **Scope of Design Services**

Stage 2

DESIGN

attractive product.

NPD	Scope	Design Activities	Tools and Deliverables	
Transform the finalized design concept into design for manufacturability, cost- effective and reliable product throughout the established product development process. Proposed designs will be reviewed in an iterative manner at every stage to ensure technical problems are solved without compromise the design requirements. Continual refinement of ideation sketches, detail design drawing, 3D CAD modeling and rapid prototyping within the planned project timeline will transform the fuzzy frontend and early thoughts into a high quality and	1.3 Embedded software design	<ul> <li>Coding/Editing</li> <li>Compiler</li> <li>Debugging</li> <li>Defect Management</li> <li>Automated Tests</li> <li>Code analysis</li> <li>Version control</li> <li>Code generation</li> <li>Database management</li> <li>Packaging</li> </ul>	<image/> <image/> <image/> <image/> <list-item><list-item><list-item><list-item><image/><image/></list-item></list-item></list-item></list-item>	

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#### Stage 2 DESIGN

# Innovation Factory Collaboration with Design Houses/RIs/IHLs/COIs

#### **Scope of Design Services**

NPD	Scope	Design Activities	Tools and Deliverables	🛕 AUTOCAD
	1.4 Mechanical Design (Packaging, Plastics, electronics packaging with metal work)	<ul> <li>Geometric Dimensioning and Tolerancing</li> <li>Data import and reuse</li> <li>Advanced 3D part and assembly design</li> <li>AR and export to third party AR/VR/MR</li> <li>Sheet metal design</li> <li>Design for cost</li> <li>Frame &amp; weldment design</li> <li>Surface modelling and Plastic part design</li> <li>Jig &amp; fixture design</li> <li>Conceptual assembly layout</li> <li>Cam and Gear design</li> <li>Pulley &amp; shaft, Spring design</li> <li>Beam &amp; column design</li> <li>Electrical routing</li> <li>PCB collaboration</li> <li>Pipe and tube routing</li> </ul>	<ul> <li>Automated 2D drawings</li> <li>Standard parts library (includes machinery content)</li> <li>Animation and Advanced photorealistic rendering</li> <li>IFC import &amp; export for Building Information Modelling (BIM)</li> <li>Mesh data reuse (Convergent Modelling)</li> <li>Reverse engineering (3D scanning)</li> <li>3D print preparation and service</li> <li>Generative design and Data management</li> <li>Inventor data migration</li> <li>Pro/Engineer / Creo data migration</li> <li>Cloud-ready productivity (log-in license, cloud-based collaboration, free viewing tools)</li> </ul>	<image/>
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SIMTech

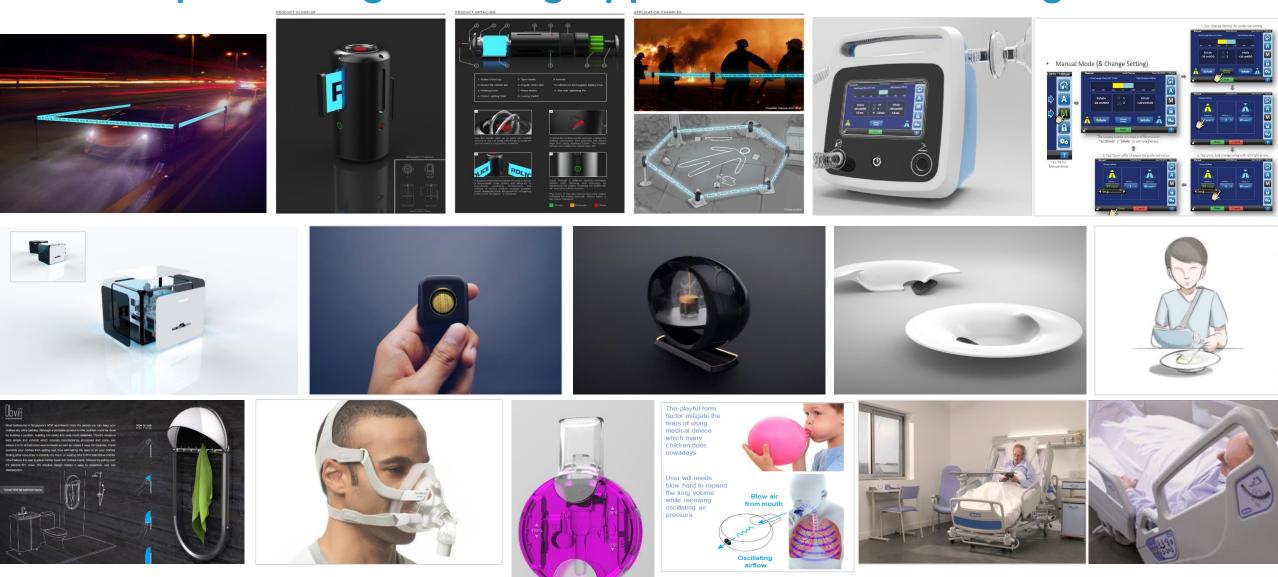
	Stage 2 DESIGN		actory Collaboration witses/RIs/IHLs/COIs	h
		Scop	e of Design Services	
NPD	Scope	Design Activities	Tools and Deliverables	
	1.5 Simulation software tools	<ul> <li>Mold flow analysis</li> <li>Simulation (Vibration, Frequency, Buckling, Thermal, Drop Test, topology optimisation, non-linear materials, large deformations)</li> <li>Pipe, tube, duct and wire routing</li> <li>Environmental Impact Analysis</li> <li>Structural part and assembly analysis</li> <li>Advanced surface flattening</li> <li>Advanced motion simulation</li> <li>Advanced stress simulation</li> </ul>	<ul> <li>Comsol Multiphysics (complex multiphysics interactions e.g. thermal, electrical, mechanical, fluids)</li> <li>Matlab Simulink (dynamic simulation of systems, Hardware in the loop simulation)</li> <li>Labview (Real-time simulation and control)</li> <li>Recurdyn (Multibody dynamic simulation)</li> <li>Ansys – Fluent (CFD analysis)</li> <li>Ansys – Maxwell (EM analysis)</li> <li>Ansys – MotorCAD (Electric machine)</li> </ul>	<section-header></section-header>

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SIMTech for Industry

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#### **Examples - Design Thinking Approach to Product Design**







## Artist Impression of IF@CT2B (Front View)



for Industry

SIMTech

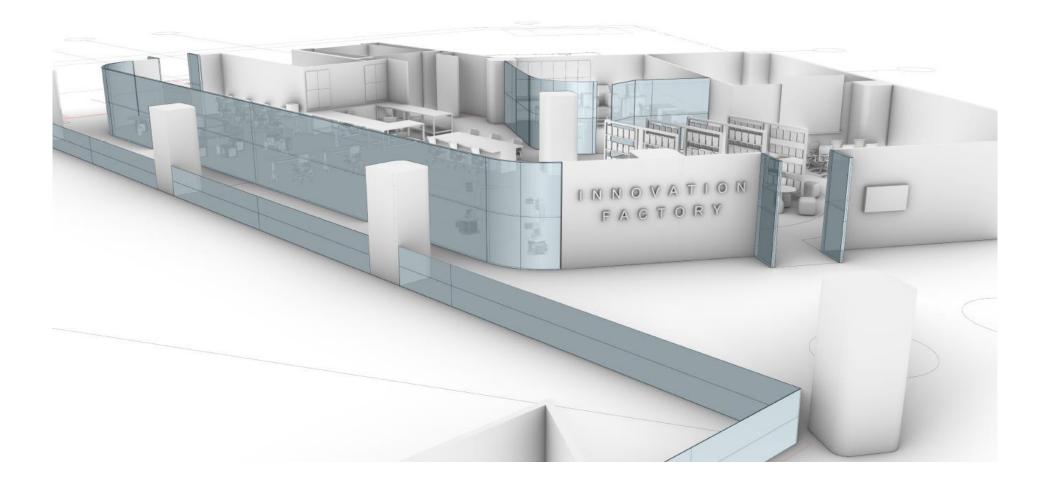
## Artist Impression of IF@CT2B (Side View)





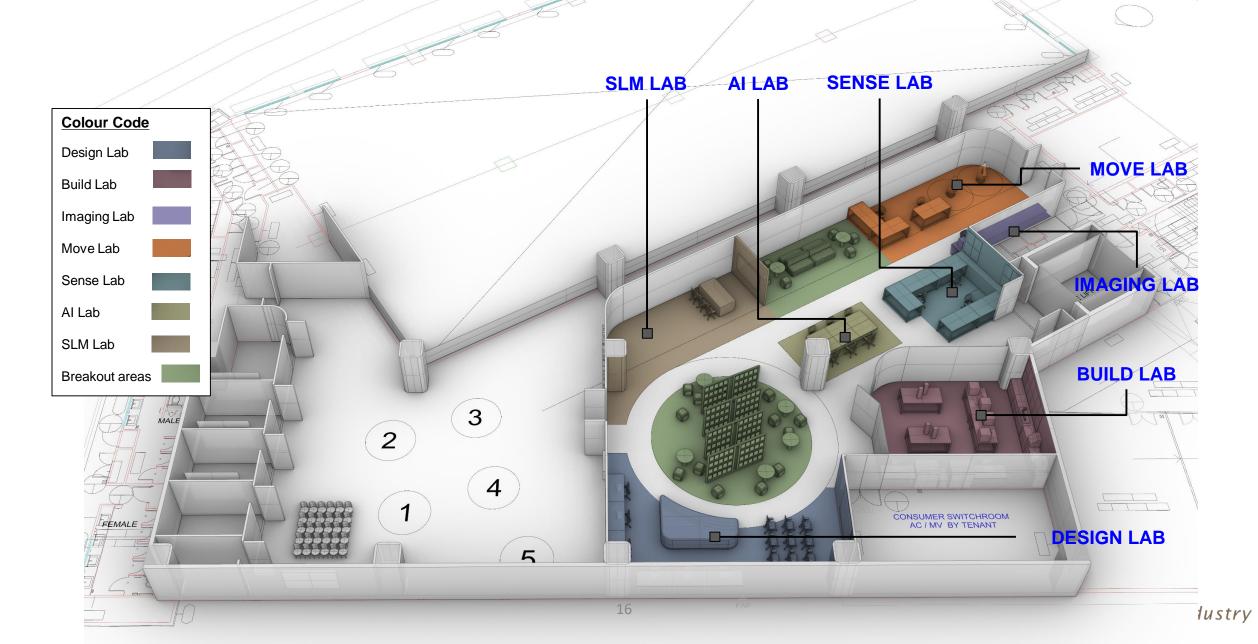


#### Artist Impression of IF@CT2B at Level 1M



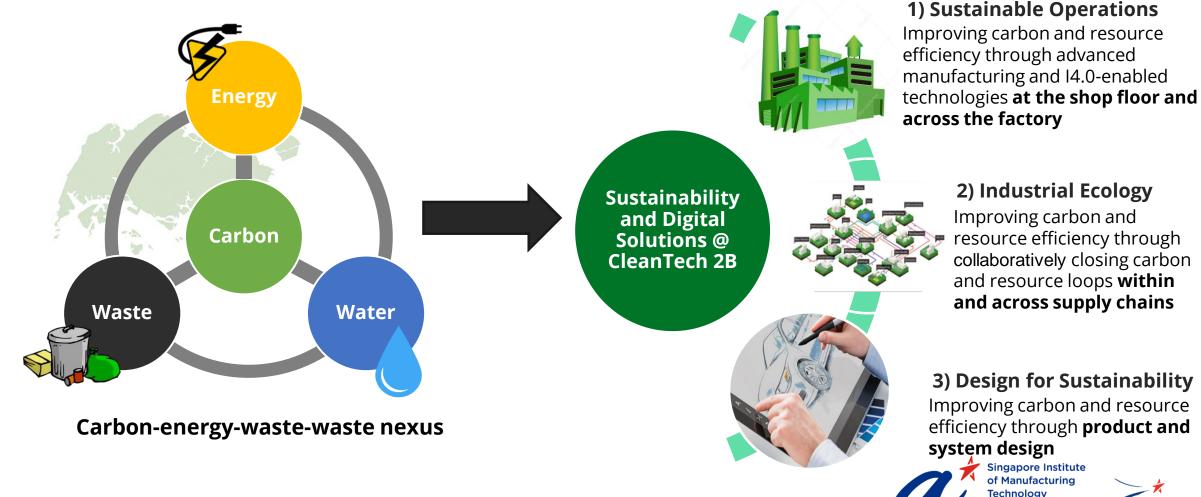


#### Artist Impression of IF@CT2B at Level 1M



#### Sustainability and Life-Cycle Management Lab Offering Underlying Technology Themes

In addressing the nexus of carbon-energy-water-waste, **technologies will be demonstrated through 3 themes**: 1) **sustainable operations**, 2) **industrial ecology**, and 3) **design for sustainability**.



### Pilot Innovation Factory @ Valley Block

Total Space: 126sqm / 1357sqft



Technology

SIMTech

for Industry

#### **Proposed Designs for the Workshops for IF@CT2B**

General guidelines: -Dark theme -Tools must be easily accessible -All things must be visible, use glass cabinets -All tables must be on wheels -All dusty operations in dust room -Small painting booth -Maximum storage space everywhere -No fumes, no dust allowed -No exposed wires on the floor -Storage rack of raw materials -Bright lighting -Ample power point and compressed air outlet -Storage locker with lock and key -Partitions on wheels -Small discussion area -Water basin and chemical sink -Fume hood for 3D printer to exhaust -Large dustbins













https://www.walicontrol.com/















://www.the5sstore.com/perfo-stor-tool-system.html







19





#### **Proposed Designs for the Workshops for IF@CT2B**

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General tools

General tools

General tools Power tools





https://www.diytools.sg/index.php

















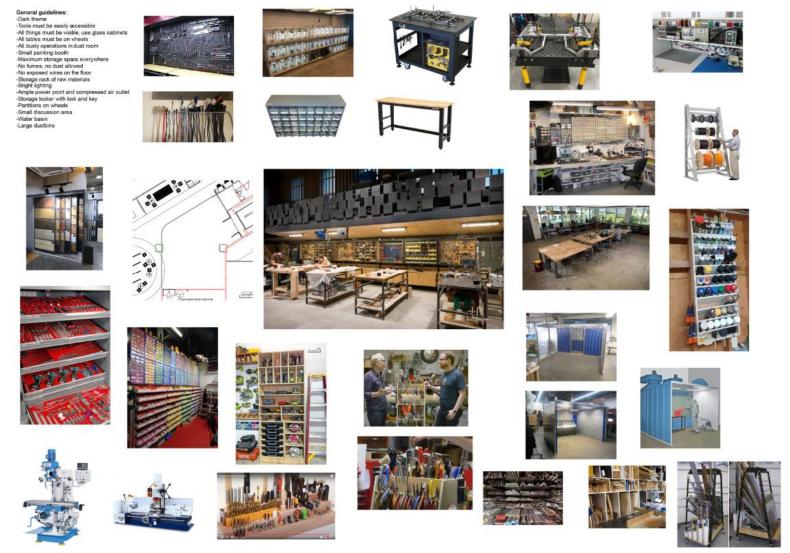








#### **Proposed Designs for the Workshops for IF@CT2B**







# **Innovation Factory Build Lab Facilities and Services**



# Markforged X7 Continuous carbon fiber

- Fused filament fabrication, Continuous Filament Fabrication
- Top-of-the-line industrial grade platform with strengthened dual nozzle print system that supports Continuous Carbon Fiber and Kevlar reinforcement.
- Build Volume

#### 330 mm x 270 mm x 200 mm

- Layer Height 50 µm
- Onyx, Onyx FR, Nylon White Fibers, Carbon fiber, fiberglass, Kevlar®, HSHT fiberglass
- Tensile Strength 800 MPa (25.8x ABS, 22.2x Onyx)
- Flex Modulus 51 GPa (24.8x ABS, 14.2x Onyx) \*

#### Metal X Metal 3D

- Atomic Diffusion Additive Manufacturing (ADAM)
- Top-of-the-line industrial grade metal printing
- platform featuring 17-4 PH Stainless Steel PH, Tool Steel, Inconel 625 and Copper materials.
- Build Volume 300 x 220 x 180 mm (11.8 x 8.7 x 7.1 in)
- Max Post-Sinter Part Size 188 x 54 x 52 mm
- Metal material with ceramic release layer
- Layer height 125 µm and 50 µm, post-sinter





# **Innovation Factory Build Lab Facilities and Services**





#### Georg Fischer +GF+ <u>DMP</u> <u>Flex 350</u>

- Laser Powder Bed Fusion system
- Build Volume: 275mm x 275mm x 420mm
- Layer thickness: 10-100µm
- Laser: 500W Fiber Laser
- Efficient Bidirectional
   Recoating system
- Time-saving Removable Print Module
- Seamless All-In-One
   Integrated Software



#### +GF+ <u>CUT AM 500</u>

- Wire Electrical Discharge
   Machining (EDM) system
- Cut Volume: 510mm x 510mm x 510mm
- Cutting Speed: 280 mm<sup>2</sup>/min
- Accuracy: ±0.1mm
- Horizontal EDM, Tilting table, Rotary axis and collection basket prevent damage of cut parts
- Cost-saving and Efficient
   Double Spool Concept
- Integrated Clamping system for easier referencing





# Innovation Education Consulting Train R&D talent, address gaps • Develop l&E talent (OJT) Train R&D talent, address gaps • Develop l&E talent (OJT) • Expand pool of deep-tech talent (consulting regression (IFP)

Labs	Expertise	Subject Matter Experts (Current)	Plans – Engaging Beyond SERC
Design	Design Thinking and AM; Human Centered Innovation with Design Thinking; NX for design; Simcenter; PLM	Rayner Ng, Duane Lye, Chikashige Kiyoshi, YY, Thaddie, Tnay Guan Leong, Kentaroh Toyoda (S&A), Clive Stanley Ford (IHPC), Lai Szu Cheng, YIN Xuesong, Chiam Sing Yang (IMRE)	SG:D OPEN INNOVATION PLATFORM
SLM	Design & Simulation Software	Johnathan Low, Daren Tan, Yeo Zhiquan (SIMTech)	Diagnostics Development Hub
Sense	Industrial IoT; Analytics Software Sensors & IoT hardware	Liu Wei, Wen Rong, Xiao Long (SIMTech); Cui Shan (NMC), Kwok Yuen Sam, Wong Kok Wai (I2R); YIN Xuesong (IMRE)	
AI	Autonomous AI platform, Brain-Machine, Neural Interfaces, Digital Manufacturing	Liu Wei (SIMTech); Clive Ford, Gao Fei (IHPC); Xue Yang (I2R)	BIODESIGN NGEE ANNE NGEE ANNE SINGAPORE SINGAPORE SPOLYTECHNIC
Move	Process and Plant Simulation; Cobots & AIV	Tnay Guan Leong, Tao Ming (SIMTech), Tijo Thayil (ARTC)	Singapore Institute
Build	AM; Machining, Regenerative processes	Wiria Florencia, Soh Fang Hui, Thang & Liu Kui (SIMTech), Alin Patran, Matthew King (ARTC)	of Manufacturing Technology SIMTech
Imaging	Inspection tools	Leon Li Xiang (SIMTech), Shihua (NMC)	

# **Pilot Innovation Factory Membership**

	Member's Benefits	Membership Types		
lory	Member 5 Denents	Gold	Platinum	
Category	MNCs, LLEs, (fee per annum <sup>1</sup> )	\$4,000	\$6,000	
Ű	SMEs, Start-ups (fee per annum²)	\$2,000	\$3,000	
	Recognition <sup>3</sup>	$\checkmark$	Priority⁴	
hip s	Complimentary Hot desking	$\checkmark$	Priority⁵	
ers  rice:	Lounge Access	$\checkmark$	$\checkmark$	
Membership Services	Reward points do not expire	$\checkmark$	$\checkmark$	
Me	Exclusive membership access card	$\checkmark$	$\checkmark$	
	Complimentary parking	$\checkmark$	Priority <sup>6</sup>	
	Special offers and invitation to events and promotions	$\checkmark$	Priority <sup>7</sup>	
	Standard subscription <sup>8</sup>	$\checkmark$	$\checkmark$	
0	Access to Innovation Factory	$\checkmark$	Priority <sup>9</sup>	
R&D	Consultation	$\checkmark$	Priority	
	Use of design tools and equipment	$\checkmark$	Priority	
Further Education	Training and Workshop Discounts (where SkillsFuture Credits or other SMEs funding or similar scheme does not apply)	20%	30%	

All figures before GST



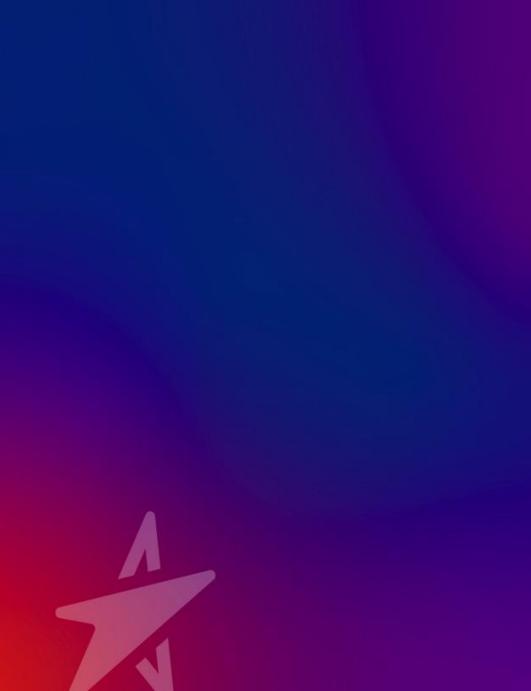
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# **Engaging Interested Companies**











# **THANK YOU**

www.a-star.edu.sg/SIMTech

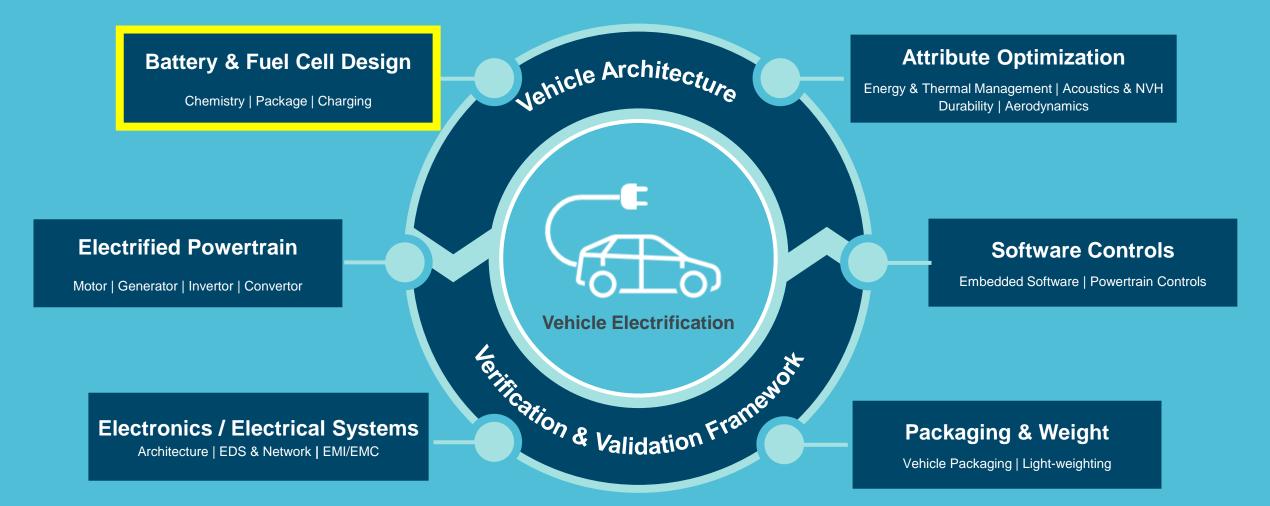


# Adopt a model-based development strategy to boost battery performance

Unrestricted @ Siemens AG 2019

#### Siemens Digital Industries Software engineering solutions

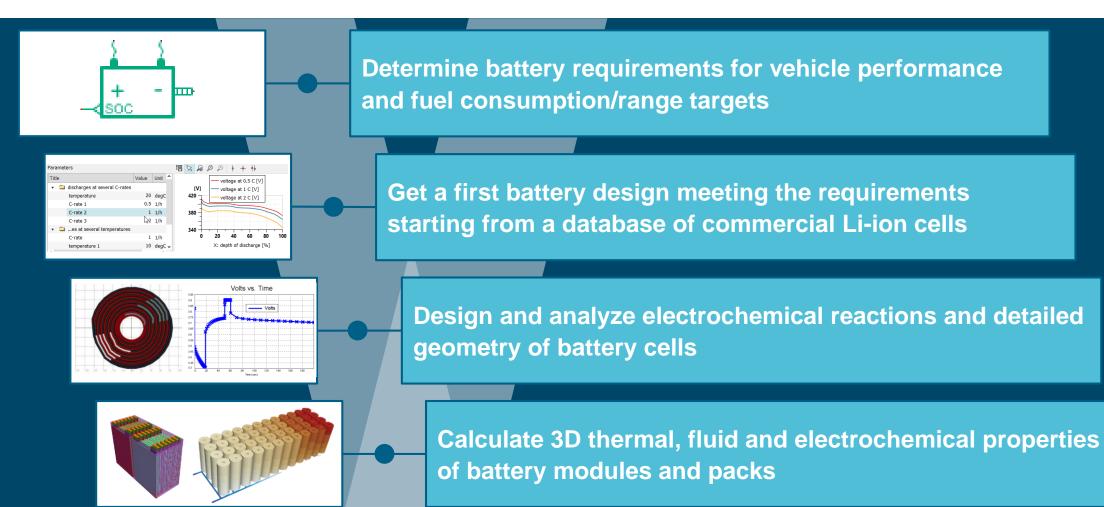
Catering to a wide range of vehicle electrification needs



#### Simcenter simulation solutions for battery design

Scalable solutions for tiered collaboration

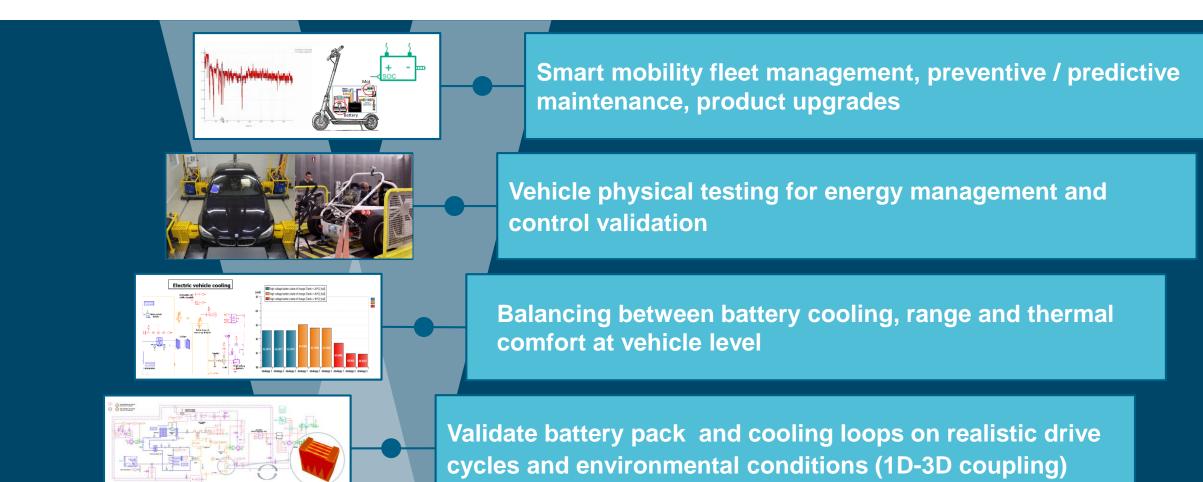




#### Simcenter simulation solutions for battery design

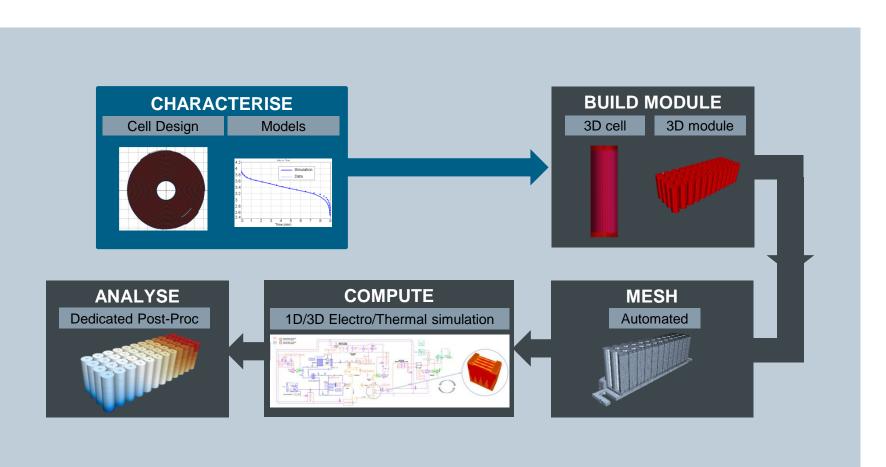
Scalable solutions for tiered collaboration





## **Drive Battery Innovation** Design Exploration

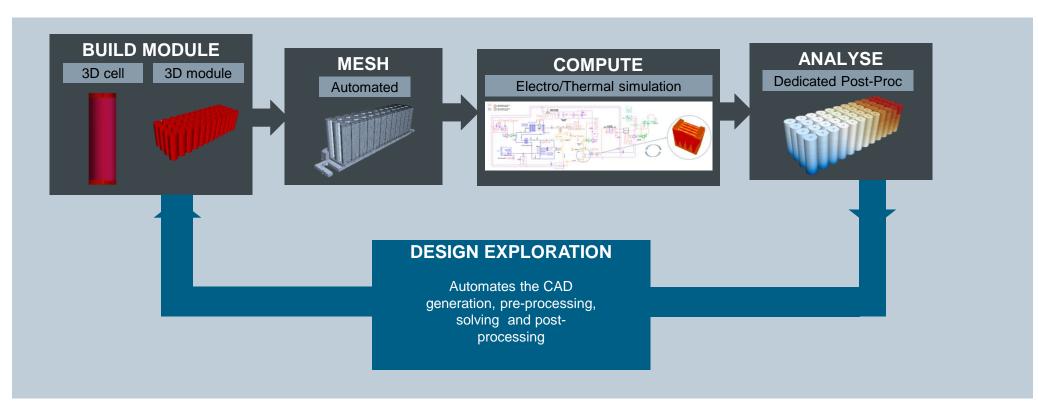




**Engineer Innovation** 

## **Drive Battery Innovation** Design Exploration



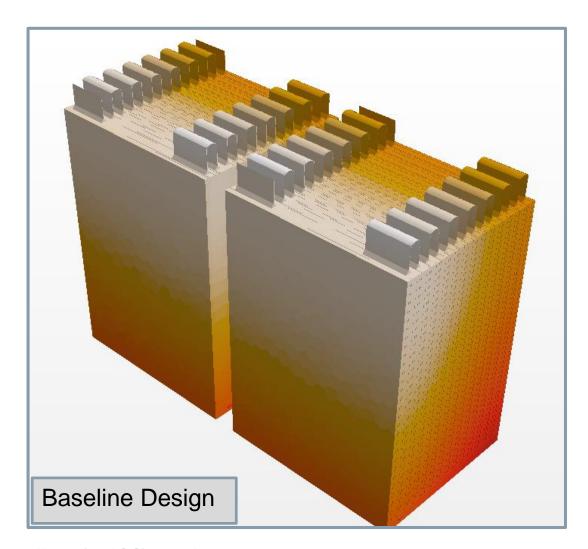


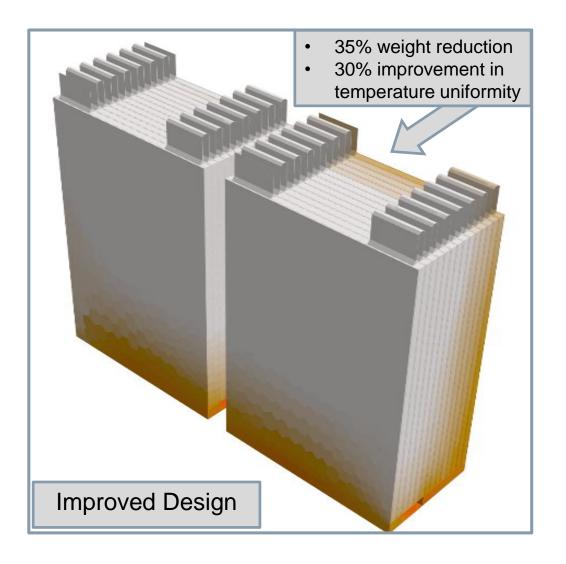
## **Engineer Innovation**

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### **Drive Battery Innovation** Design Exploration

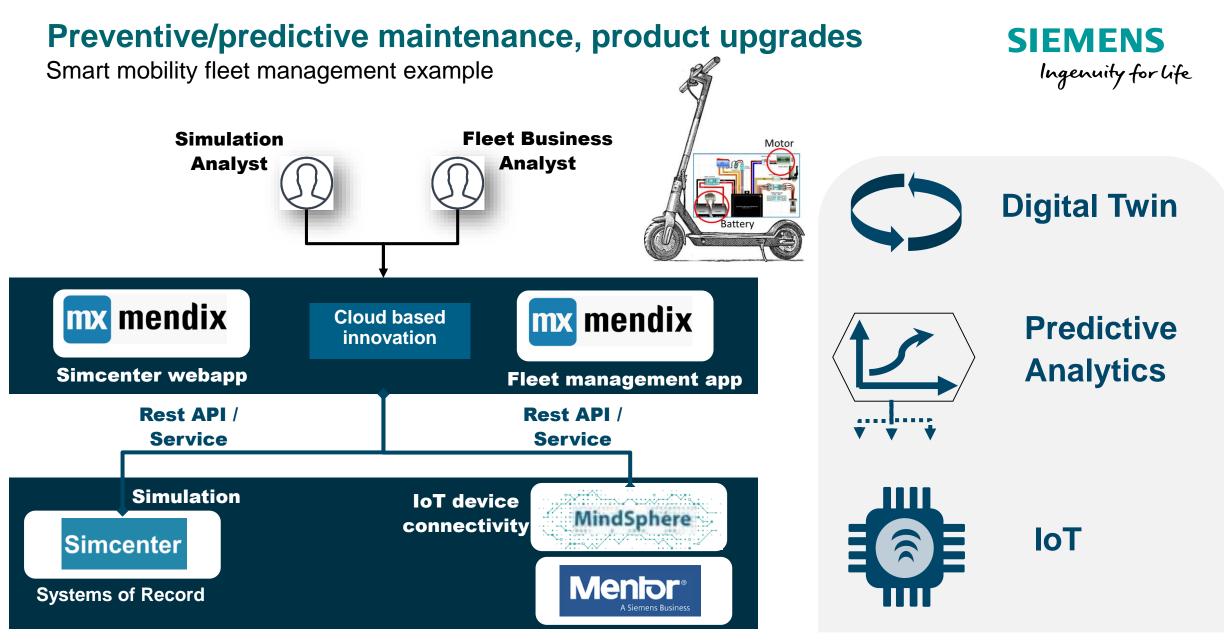






Unrestricted © Siemens AG 2019

Page 7 2019-03-13



Unrestricted © Siemens AG 2019 Page 8 2019-03-13 Devices

Rules

දිටුදු Config

Critical	3	Warning	16	Connected <b>7</b> Offline <b>2</b>
				Yeipa Br
The fleet			e	Golden Gal
Bike1004	Last Connected 6/5/2019	Target status Running	Device Status Alert	
Bike1001	Last Connected 6/5/2019	Target status Running	Device Status OK	SAN FRANCISCO COW HOLLOW Add device
Bike1002	Last Connected 6/5/2019	Target status Running	Device Status OK	SEAOFF OOO HEIGHTS LOWER PACIFIC HEIGHTS TENDERLOIN SOUTH BEACH
Bike1003	Last Connected 6/5/2019	Target status Running	Device Status OK	OUTER DISTRICT SOMA CHINA BASIN
Bike1005	Last Connected 6/5/2019	Target status Running	Device Status OK	HAIGHT-ASHBURY MISSION BAY
Bike1006	Last Connected 6/5/2019	Target status Running	Device Status OK	
Bike1007	Last Connected 6/5/2019	Target status Running	Device Status OK	INNER SUNSET THE CASTRO MISSION DOGPATCH
Bike1008	Last Connected 6/5/2019	Target status Offline	Device Status OK	NOE VALLEY
Bike1009	Last Connected 6/5/2019	Target status Offline	Device Status OK	SUNSET DISTRICT OF OREST HILL Vista Del WEST PORTAL Vista Del Monte
				PORTOLA
				BALBOA PARK EXCELSIOR
				PARKMERCED INGLESIDE VISITACION VALLEY
80/index.html#				Google Map data @2019 Google Terms of Use Report a map error

4<sup>®</sup>

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Simcenter solutions Unique value proposition for electrified powertrain development						
Reduce development cost and time with fewer prototypes	Analyze vehicle/powertrain architectures earlier in the development cycle	Virtually assess systems interactions				
Study the influence of control strategies on fuel consumption, emissions and performances	Balance critical attributes: fuel economy, performances, passenger comfort and range	Find the best comprise to fit both regulations and market requirements				

## UL 1974 Creating a Safe Second Life for Batteries



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**Empowering Trust**<sup>™</sup>

## **UL, a Global Safety Science Organization**



## OUR MISSION Working for A Safer World

Since 1894



## **UL Empowering Trust**

#### Underwriters Laboratories (Nonprofit)



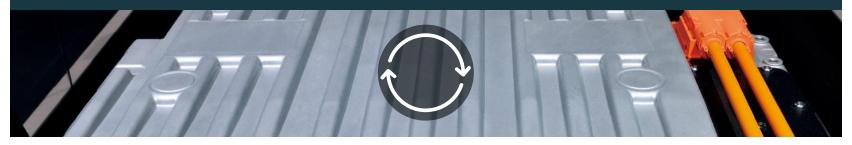
#### **UL - Business Solutions**



Testing, Inspection & Certification Software as a Service Advisory Services

## Why UL standard for Repurposing Battery?

- Electric vehicle (EV) battery system is expensive with high performance requirements.
  - ▶ 20-30% energy loss means it may not be able to support the EV performance needs
- Sustainability and environmental protection. Li-ion batteries are not readily recyclable.
- Public and regulator misperception of "2<sup>nd</sup> hand" batteries being unsafe.
- If recertify every repurposed end-product, it is highly ineffective, expensive, both time- and sample-consuming.
- Strong industry need and no standard back then.





## UL 1974 Standard Scope





JOINT CANADA-UNITED STATES NATIONAL STANDARD

- Covers the sorting and grading process of battery packs, modules, and cells that were originally configured and used for other purposes—such as electric vehicle propulsion—and that are intended for a repurposed use application, such as for use in stationary energy storage and other applications
- The process of sorting and grading these devices is essentially determining the state of health and other parameters to identify continued viability and the rating mechanisms the manufacturer may use for those that are determined suitable for continued use
- Published in Oct 2018. Also recognized as a US and Canada binational standard

#### STANDARD FOR SAFETY

ANSI/CAN/UL 1974, Evaluation for Repurposing Batteries

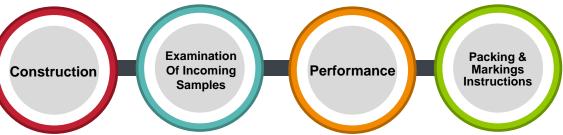




## **Evaluating and Repurposing Batteries**



- UL 1974 is a "**manufacturing process**" standard that looks at the methods used to determine the safety and performance of batteries, modules, and cells from used EV battery systems (i.e. repurposing process)
- Assembled batteries need to meet the end product requirements when re-assembled into a 2<sup>nd</sup> use battery
  - e.g. UL 1973 is used for stationary batteries





## Standards Technical Panel of UL 1974 – Repurposing Batteries

Interest Category	Number of STP members	
Producer	11 – Manufacturers from US, Canada, Japan and Taiwan	
Testing & Stds Org	7 – Incl. UL and other international testing bodies from US, China and Taiwan	
Supply Chain	2 – BMW and Rejoule Energy from Germany and US	5.0%
General	11 – Institutions, Associations and Consulting firms from US, Canada, China and Taiwan	27.5%
Government	3 – US Army, National Research Foundation of Canada and Pacific Northwest National Laboratories	7.5%
Commercial & Ind Users	1 – from US	2.5%
Regulators/AHJ	1 – NY City Dept of Buildings, Alberta Municipal Affairs, etc, from US and Canada	12.5%

- Approved by independent panel of volunteers from 6 countries/territories in North America, Asia and Europe
  - **Commitment of STP member**: Vote, provide comments, provide inputs to comment resolutions, help develop proposals to the standard.
- Balanced representation no category with 1/3 of total representation
- Open for participation by Singapore expert at no cost



## Gaining traction globally

As one of its kind of standards, UL 1974 received global interests, e.g.

#### THE POSITIVE SIDE OF BATTERIES

THE ROLE OF STANDARDS IN SUPPORTING SUSTAINABILITY REQUIREMENTS FOR BATTERIES

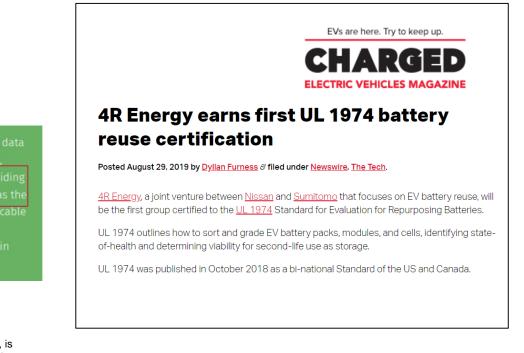


#### CONCLUSION

Standards must be developed to allow the open data requirement on BMS (format, test protocols, SoH, diagnostic connector). In parallel, standards providing a method to test batteries for second use (such as the UL 1974) are also needed. Finally, standards applicable in first life of batteries should be developed in coherence with those governing the second life, in order to facilitate reuse.



ECOS, European Environmental Citizen's Organisation for Standardisation, is officially recognised in the EU as one of the four organisations whose work is supported to ensure standards serve society. <u>Link to study</u>



## Wish to learn more?



Joint Webinar on Repurposing Batteries Standards (Coming soon)

Or contact me directly: Kolin Low Regional Standards Manager Underwriters Laboratories Kolin.low@ul.org

# Thank you!

**Empowering Trust**<sup>™</sup>

## **UL Standards Recognition**

#### Organization Legacy

• A leading standards developer with strong legacy and track

records



 Open, Research-based standards with quick response to market needs

#### **International Level**

- Supports implementation of WTO TBT agreement and other multilateral systems
- Coherence with other International Standards Developers e.g. ISO and IEC





#### **National Level**

• Developing national standards in the US, Canada and Mexico



 Support development & adoption of UL standards globally





## Battery: Chemistry and Beyond

#### Future Development of Lithium-Ion Battery Technology



Dr. Shen Nan September 2020



#### **ABOUT DURAPOWER**

### **CURRENT TECHNOLOGY**

#### **RESEARCH FOCUS AND CHALLENGES**

Q & A



#### **ABOUT DURAPOWER**

#### **CURRENT TECHNOLOGY**

#### **RESEARCH FOCUS AND CHALLENGES**

Q & A

## WHO WE ARE

Established in 2009, Durapower offers a closed-loop, end-to-end energy storage solution for the electric mobility and renewable energy ecosystem. The company is focused on research and design of Lithium-ion battery (LIB) materials, battery cell manufacturing, and integration of battery systems, delivering state-of-the-art energy storage solutions for electric vehicles and renewable energy globally.

With professionals in the automotive and renewable industry of more than 15 years of experience and a wholly-owned battery cell manufacturing facility, Durapower is a tier-one supplier to vehicle manufacturers and has its battery systems integrated into thousands of Electric Vehicles (EVs), Hybrid Electric Vehicles (HEVs) and Plug-In Hybrid Electric Vehicles (PHEVs). The company has achieved a remarkable safety track record over the years, covering hundreds of million kilometers of operational mileage and deployed various scales stationary storage solutions for on and off Grid applications. Headquartered in Singapore and with subsidiaries in China, Europe, and Thailand, Durapower works closely with government agencies, blue-chip customers, and partners to deliver our solutions to over 20 countries and 45 cities globally.





Proud member of :

ociation of Asia Pacifi



durapower



## **MANUFACTURING AND R&D FOOTPRINT**



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# **OUR GLOBAL MARKET PRESENCE**



## 45 Cities & Growing

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#### **ABOUT DURAPOWER**

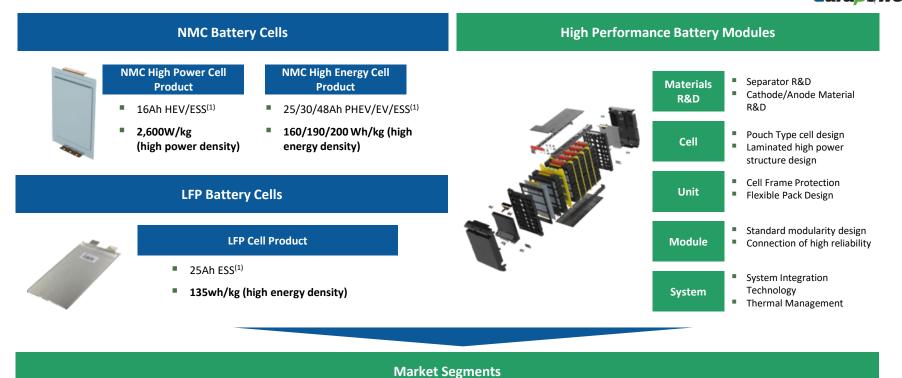
## **CURRENT TECHNOLOGY**

#### **RESEARCH FOCUS AND CHALLENGES**

Q & A

# **KEY PRODUCTS & APPLICATIONS**

durapower





(1) HEV: Hybrid Electric Vehicle, PHEV: Plug-in Hybrid Electric Vehicle, ESS: Energy Storage System

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#### **ABOUT DURAPOWER**

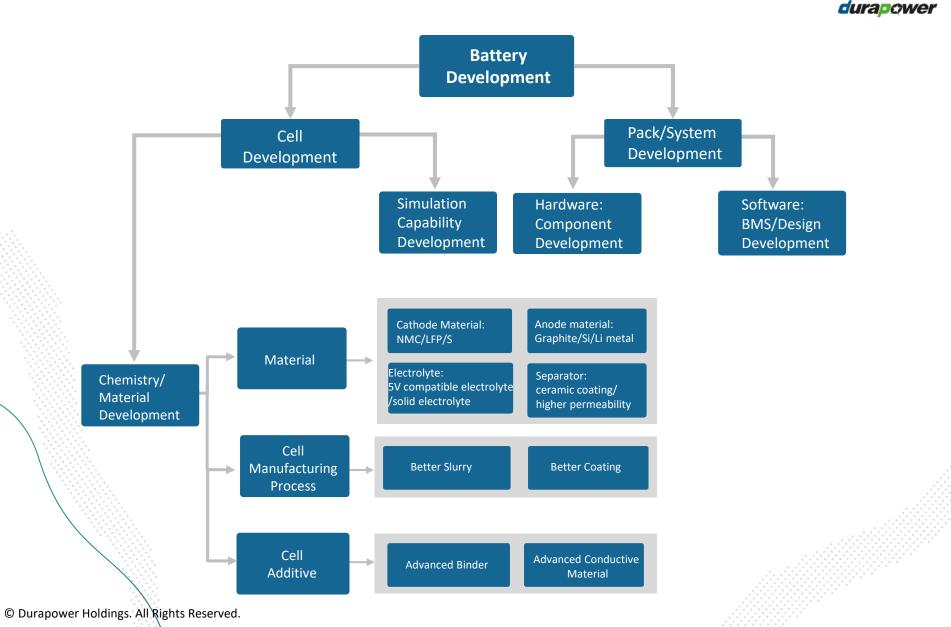
#### **CURRENT TECHNOLOGY**

### **RESEARCH FOCUS AND CHALLENGES**

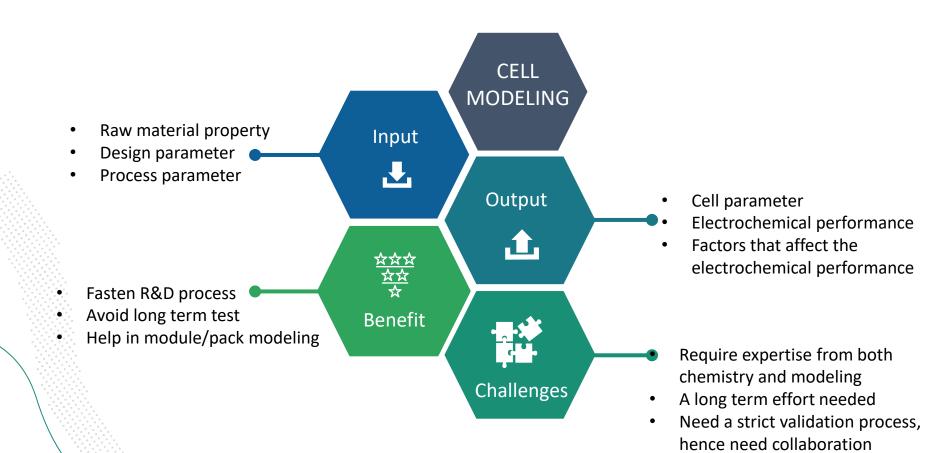
Q & A

# **RESEARCH FOCUS AND CHALLENGES**

dp







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# **RESEARCH FOCUS AND CHALLENGES**



РАСК	РАСК	2 <sup>ND</sup> LIFE BATTERIES
<ul> <li>PACK</li> <li>BMS</li> <li> <ul> <li>Monitor SoC/SoH more accurately</li> <li>Adopt more accurate balancing strategy</li> <li>Active balancing</li> <li>I based technology to active predict the future behavior of the battery</li> </ul> </li> </ul>	SIMULATION Mechanical/ thermal simulation to predict battery behavior	<ul> <li>Life cycle prediction: need to anticipate the behavior of battery after 80% EoL</li> <li>Redesign and optimize of battery system:         <ul> <li>Efficient sourcing strategy to pick up "similar" batteries</li> <li>Special BMS development:2<sup>nd</sup> life battery is supposed to have larger variation; hence, a more powerful balancing strategy would be required.</li> <li>System design: due to change of application, the system component such as thermal design needs to be restructured</li> </ul> </li> </ul>
<ul> <li>Remote upgrade and diagnose technology</li> </ul>		

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#### **ABOUT DURAPOWER**

#### **CURRENT TECHNOLOGY**

#### **RESEARCH FOCUS AND CHALLENGES**

Q & A

# Q & A



# **THANK YOU**



#### durapower

66 Kallang Pudding Road #05-02 Singapore 349324

⊠ info@durapowergroup.com

www.durapowerbattery.com

**in** Durapower Holdings Pte Ltd

# High-precision current pulse for fast battery diagnostics

**SBC Battery Analytics roundtable** 

Andreas Hauser – Deputy Head, ESS Singapore, 24<sup>th</sup> September 2020



#### Intro: Where is (fast) battery diagnostic especially relevant?



#### **Battery system production line**

- Assembly of individual cells to (large scale) battery systems involves many steps
- Substandard welds / connections can lead to performance loss / safety issues
  - Challenging to check every weld how?

#### Second life applications

- Usage of "still good" batteries after a primary application usage (in e.g. EVs)
- Determination of "still good" difficult
  - Different usage leads to different remaining capacity / internal resistance
  - Is it still save to use?



Source: Tesla



Source: BMW



#### Intro: What methods are typically used today?



#### Resistance measurement (R<sub>AC</sub>), e.g. 1 kHz

- Fast, flexible and easy to understand result (an impedance value)
- → Significance of result not clear, difficult to compare results from two systems (what does it mean? capacity?)
- $\rightarrow$  Little link of single impedance to SoH / SoF

#### Impedance spectroscopy (EIS)

- Takes long to measure, needs expert to understand
- Correlation between SoH / SoF and EIS to some degree, requires study with multiple samples
- $\rightarrow$  Difficult to derive single pass / fail criteria

#### High-power pulse (HPPC & R<sub>DC</sub>)

- Needs accurate cyclers and expert to evaluate correctly (automatic evaluation possible, but no ready solution on market)
- Gives good picture of dynamic behaviour but no information about residual capacity
- $\rightarrow$  What does the result mean regarding SoH?

#### Cycling (e.g. discharge performance)

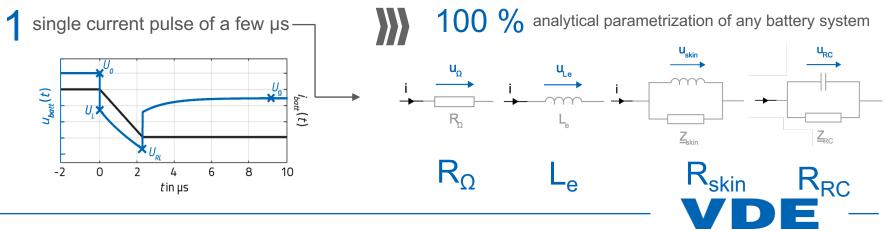
- Takes very long (> 2h), but gives accurate residual capacity
- Requires expensive cyclers, no classification of the internal resistance
- → Test duration and cost makes it not feasible for large-scale (i.e. mass-) production



#### Novel high-speed approach based on precision current pulse



- Usage of a single high-precision current pulse of a few µs duration and high-accuracy recording of battery cell / -module or -pack voltage response
- Equivalent battery circuit components contribute to voltage response, in connection with novel algorithms and battery database allows to assess & classify battery cell / -module / -pack accurately, with high significance and repeatability
- Automatic post-processing & evaluation possible, enables usage by technicians as well as experts and in automated environments, making this approach highly flexible, low cost and time efficient



#### **Technology in detail**



current pulse i and iu U<sub>skin</sub>  $u_{RC}$ U<sub>Le</sub> UΩ voltage response *u* at battery terminals  $R_{o}$ Le Z<sub>skin</sub>  $\underline{Z}_{RC}$ U **U**<sub>Le</sub> single contributions  $U_{Le}$  ,  $U_{skin}$  , $U_{\Omega}$ **U** skin U<sub>skin</sub> to overall voltage Z<sub>skin</sub> response u *U*<sub>Ω</sub>  $R_{o}$ 



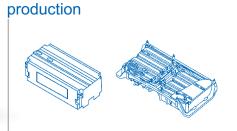
#### Use cases for battery module / -pack industry





#### A Solution by VDE RE & partners

- Standalone hardware + software
- Contacting units + multiplexers
- Contract research + battery database
- Quality certificates for each system



Module / pack test (End of Line)

- Welding spots / connectors / plugs
- Electronics
- Mech. structure & integrity



2nd life



#### Service / Maintenance

- Functionality / safety
- Error detection & predictive maintenance
- Valuation

### Reuse & Recycle

- Assessment
- Classification
- Valuation



# Thank you for your attention!

We shape the e-dial future. Experience it with us.

#### Your contact:



Andreas Hauser Deputy Head, Energy Storage Systems

Phone: +65 9151 1798 andreas.hauser@vde.com

#### Our services:

•

- R&D for industrial clients
- Testing & certification on cell-, module-, and pack / system level (including BMS)
  - Performance and lifetime testing with 200+ test channels for various system sizes (all chemistries)
  - Safety testing in specially designed bunker
- Inspections (Factory, ESS sites, pre-shipment)
- Accident investigations (battery forensics)
- Consulting, due diligence and development support



