

# Research on Energy Transition, Digitalisation and Cyber security

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**cigre**

For power system expertise

# My research in AI, Blockchain & Energy

## Peer-to-Peer Energy Trading (£2m)



- Funded by EPSRC UK-S.Korea
- 9 partners
- Imperial college, Oxford uni., ...
- Developed distributed algorithms for energy trading
- Cost savings of 45%

Energy Efficiency & Costs Reduction

## Triangulum (€30m)



- Funded by EU H2020 SCCSP
- 22 partners
- Energy, Transport & ICT
- 47% carbon emission reduction
- MCC, UoM, MMU, Siemens, etc.

Energy Efficiency demonstrator

## Energy-IQ (£2.2m)



- Funded by BEIS UK-Canada
- 8 partners
- Power forward demonstrator project
- Led a deliverable
- Developed AI-based predictive models
  - 88% improvement

Energy Efficiency, Smart contract & data analytics

## GM-LEM (£66k)



- Funded by UKRI
- 2 partners
- Consulting for Bruntwood Ltd
- On the viability of Greater Manchester local energy market

Energy Efficiency & Costs Reduction

# My Research in AI, Blockchain & Energy

## Intelligent Auction Market (£4.7k)



- Funded by EPSRC SuperGen Network
- Travel grant for an intelligent auction-based energy trading
- AI and blockchain in energy network

Energy Efficiency & Costs Reduction

## Interlinked Computing (£58k)



- Funded by NWPST
- 4 investigators
- Effect of cobbled systems (systems of systems)
- Security implication of cobbled system
- Smartgrid case study
- UoM, MMU, Lancaster.

Energy Network, Security

## Smart EV Charging (£220k)



- KTP Funded by Innovate UK
- With Badger Energy
- To develop AI & blockchain secure smart EV charging infrastructure
- Academic advisor

Energy Efficiency, Smart contract, data analytics, security

## Remarkable (£1m)



- Funded by Marie Curie and UKRI
- With Africa and EU countries
- To develop smart and traceable agricultural farming using communication, AI and blockchain.

Smart farming, Smart contract, data analytics, security



# Agenda

- Energy transition
  - P2P-3M (EPSRC); NICE (Innovate UK)
- Energy digitalisation
  - Energy-IQ (BEIS)
- Security, risks and uncertainties to energy transition
  - Interlinked computing (NWPST)
- Outlook



# Drivers for energy transition and digitalisation: 3Ds



## 1D Decarbonisation

Global exercise in reducing carbon footprint drives energy **transition** to sustainable, greener energy systems (Net-zero).

## 2D Decentralisation

Centralised generation & transmission results in carbon emissions.

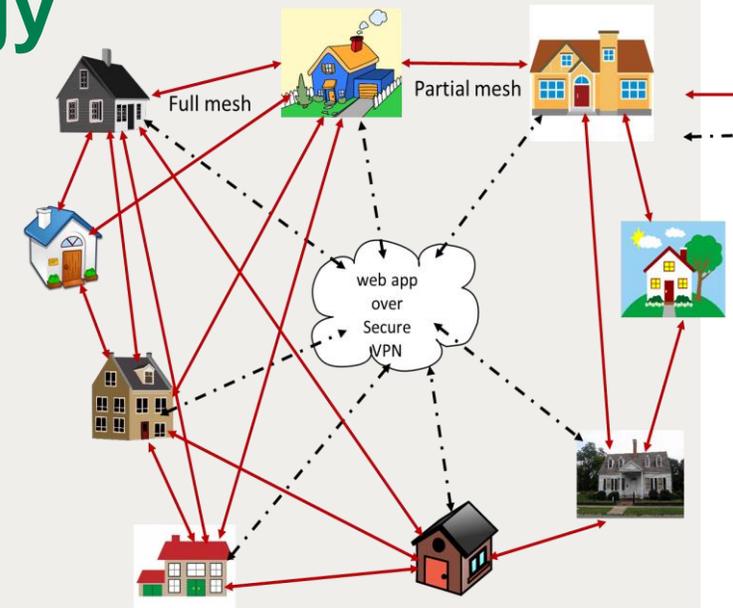
**Distributed/Multivector energy system** drives decentralisation, microgrid and prosumers, which could encourage peer-to-peer energy trading.

## 3D Digitalisation

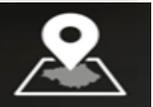
Emergence of smart meters, **IoT** and **data-driven predictive models** enhances energy efficiency and reliability further helping with decarbonisation and costs savings

# Energy transition: Peer-to-peer energy trading

- Question: How can peer-to-peer energy trading be achieved?
  - Prosumer's communication, matching, utility maximisation
- Method: To perform fundamental research on establishing communication between prosumers, matching their resources and maximising their utility while trading energy
- Impact: Environment - reduce carbon towards net-zero goal; Economic - cost savings; Society - encourage local energy consumption



UK- S.Korea



£2m

Budget



9 Delivery partners



**Jogunola, O.**, Adebisi, B., Anoh, K., Ikpehai, A., Hammoudeh, M., & Harris, G. (2022). Multi-Commodity Optimisation of Peer-to-Peer Energy Trading Resources in Smart Grid. *Journal of Modern Power Systems and Clean Energy*.

**Jogunola, O.**, Wang, W., & Adebisi, B. (2020). Prosumers matching and least-cost energy path optimisation for peer-to-peer energy trading. *IEEE Access*, 8, 95266-95277.

**Jogunola, O.**, Adebisi, B., Anoh, K., Ikpehai, A., Hammoudeh, M., Harris, G., & Gacanin, H. (2018). Distributed adaptive primal algorithm for P2P-ETS over unreliable communication links. *Energies*, 11(9), 2331.

# Energy Transition - NicE: Nigeria Intelligent Clean Energy Marketplace

- Aim: To provide access to affordable and clean energy to local communities in Nigeria through the implementation of FPP and P2P-ETS
- Method: To set up a digital twin of the model at MMU for optimisation and scalability
- Impact:
  - Environment – reduce carbon towards net-zero goal
  - Economic – cost savings
  - Society – encourage energy efficiency

UK- Nigeria



£0.6m

Budget



3 Delivery partners



Tsado, Y., **Jogunola, O.**, Nawaz, R., Gui, G., & Adebisi, B. (2021). Quantifying Self-consumption and Flexibility Provision through Battery Storage, a Deep Reinforcement Learning Approach. ICFNDs.

**Jogunola, O.**, Tsado, Y., Nawaz, R., & Adebisi, B. (2021). Energy Trading Strategy, a Deep Reinforcement Learning Approach. EPEC.

Tsado, Y., **Jogunola, O.**, Olatunji, F. O., & Adebisi, B. (2022, October). A digital twin integrated cyber-physical systems for community energy trading. *SmartGridComm*. IEEE.

# NicE: Nigeria Intelligent Clean Energy Marketplace



Capital Science Academy Abuja



Neighbouring Dafara Community

<https://guardian.ng/energy/uk-based-energy-solutions-company-provides-nigerian-community-with-24-7-renewable-energy/>

UK- Nigeria



£0.6m

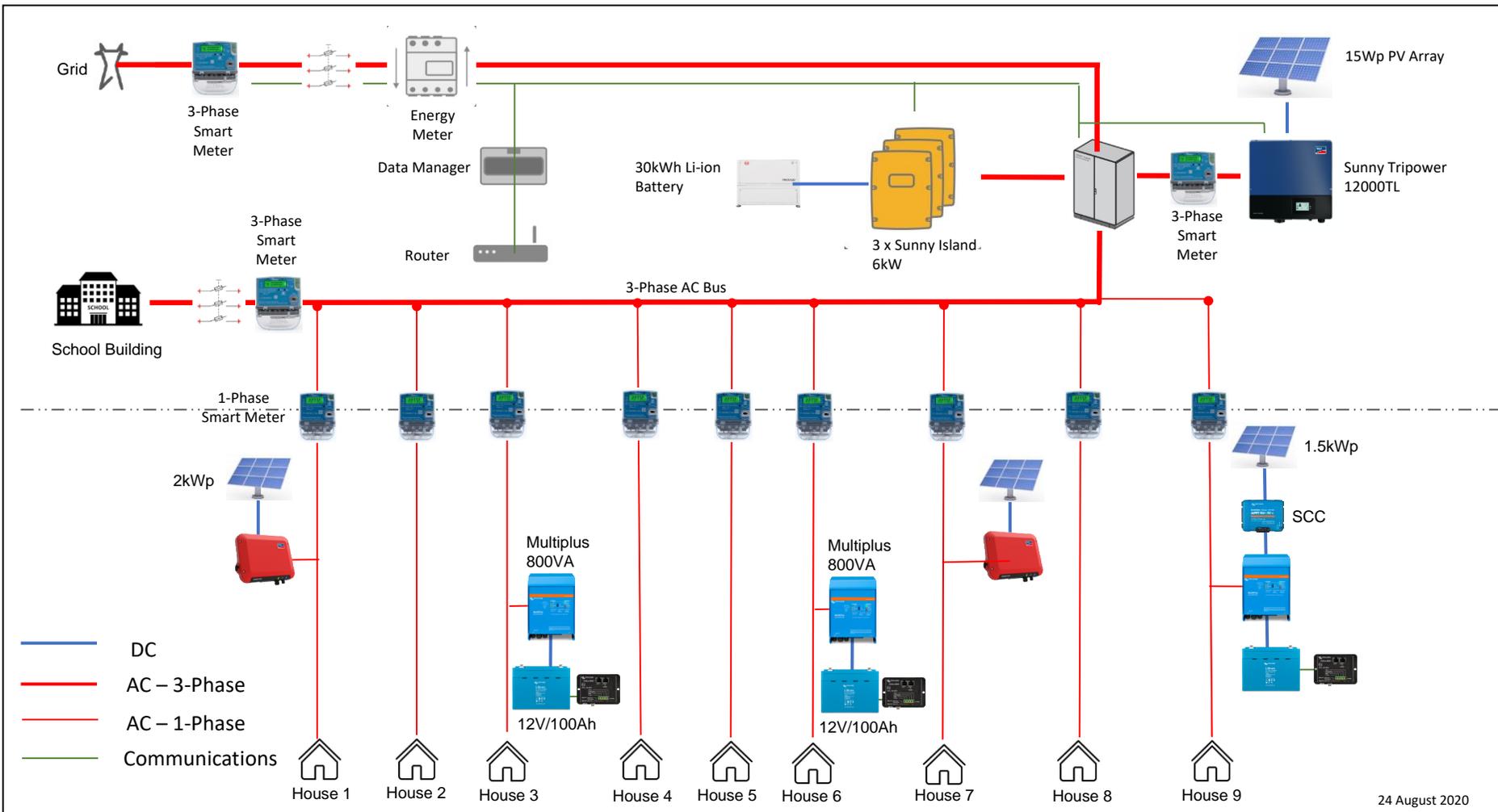
Budget



3 Delivery partners



# NICE pilot architecture at Kuje, Abuja



# NICE: Community installations



UK- Nigeria



£0.6m

Budget



3 Delivery partners



# NICE: MMU lab model &

## installations

R-Prosumer  
Battery, Load and PV

R-Prosumer  
Battery and Load

C-Prosumer  
Battery, Load and PV

R-Prosumer  
PV and Load



4 x REC solar 325W solar panels =  
1.3kWp array for each prosumer

# Drivers for energy transition and digitalisation: 3Ds



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Centralised generation & transmission results in carbon emissions.

**Distributed/Multivector energy system** drives decentralisation, microgrid and prosumers, which could encourage peer-to-peer energy trading.

## 3D Digitalisation

Emergence of smart meters, **IoT** and **data-driven predictive models** enhances energy efficiency and reliability further helping with decarbonisation and costs savings

# Research on Energy digitalisation: Energy-IQ

- Question: How can smart services accelerate flexibility provisions for costs savings for SMEs and domestic energy users?
  - To trial smart energy services for cost savings
- Method: To investigate AI and smart contract for energy market
  - To develop a predictive analytics framework for demand consumption
- Impact: Environment - reduce carbon towards net-zero goal; Economic - cost savings; Society – encourage energy efficiency

UK- Canada



£2.2m

Budget



8 Delivery partners



**Jogunola, O.**, Adebisi, B., Ikpehai, A., Popoola, S. I., Gui, G., Gacanan, H., & Ci, S. (2020). Consensus Algorithms and Deep Reinforcement Learning in Energy Market: A Review. *IEEE Internet of Things Journal*.

Tsado, Y., **Jogunola, O.**, Nawaz, R., Gui, G., & Adebisi, B. (2021). Quantifying Self-consumption and Flexibility Provision through Battery Storage, a Deep Reinforcement Learning Approach. *ICFNDs*.

**Jogunola, O.**, & Adebisi, B., Hoang, K. V., Tsado, Y. & Popoola, S. I. (2022). CBLSTM-AE: A Hybrid Deep Learning Framework for Predicting Energy Consumption. *Energies*.

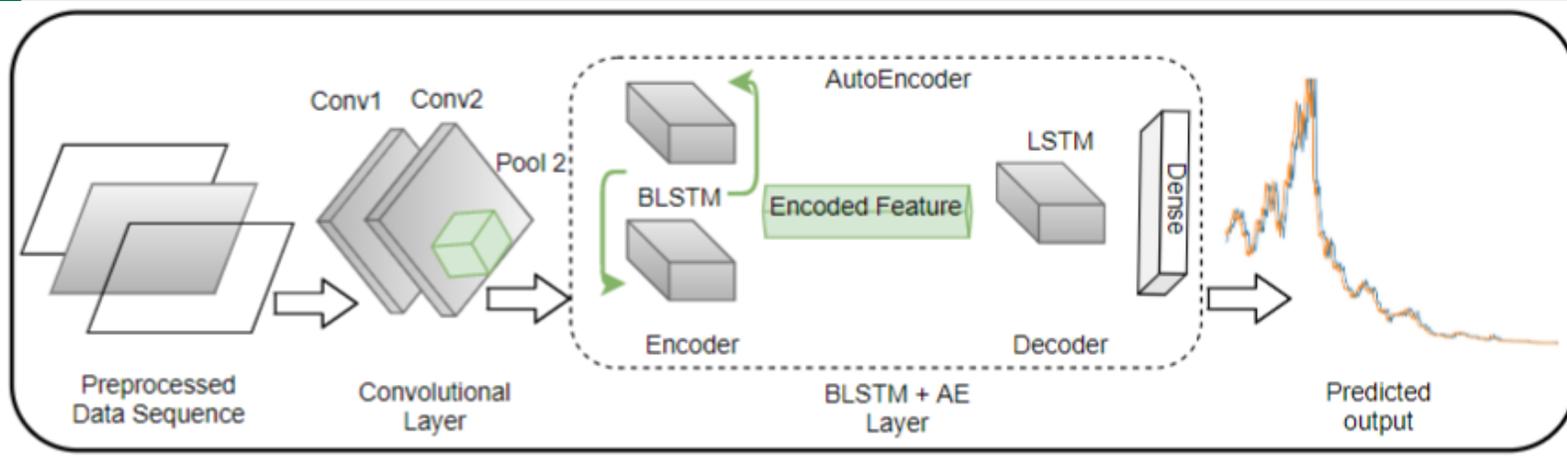
**Jogunola, O.**, Tsado, Y., Nawaz, R., & Adebisi, B. (2021). Energy Trading Strategy, a Deep Reinforcement Learning Approach. *EPEC*



# Predictive framework

Aim: To develop a predictive model for energy consumption prediction

Methodology: Deep learning: LSTM + AE + CNN



Proposed CBLSTM-AE framework

Result: Performance improvement in computation time of 56% and mean squared error of 80% to benchmark

Jogunola, O., & Adebisi, B., Hoang, K. V., Tsado, Y. & Popoola, S. I. (2022). CBLSTM-AE: A Hybrid Deep Learning Framework for Predicting Energy Consumption. Energies.

## Algorithm 1: CBLSTM-AE Algorithm

```

1 Input X
2 Output d
3 Initialise  $\omega$ 
4 for  $i = 1 \in n$  do
5   for  $j = 1 \in m$  do
6     calculate  $P_i$  from (4)
7     
$$i_t = \sigma(W_{pi}Pl + W_{hi}h_{t-1} + W_{ci} \cdot c_{t-1} + b_i)$$

8     
$$f_t = \sigma(W_{pf}Pl + W_{hf}h_{t-1} + W_{cf} \cdot c_{t-1} + b_f)$$

9     
$$o_t = \sigma(W_{po}Pl + W_{ho}h_{t-1} + W_{co} \cdot c_{t-1} + b_o)$$

10    
$$c_t = f_t \cdot c_{t-1} + i_t \cdot \sigma(W_{pc}pt + W_{hc}h_{t-1} + b_c)$$

11    
$$h_1 = o_1 \cdot \sigma(c_1)$$

12    
$$\bar{y} = \sigma(W_y h_1 + b_y)$$

13    for  $j = 1 \in m$  do
14      
$$i_t = \sigma(W_{yi}\bar{y}t + W_{hi}h_{t-1} + W_{ci} \cdot c_{t-1} + b_i)$$

15      
$$f_t = \sigma(W_{yf}\bar{y}t + W_{hf}h_{t-1} + W_{cf} \cdot c_{t-1} + b_f)$$

16      
$$o_t = \sigma(W_{po}\bar{y}t + W_{ho}h_{t-1} + W_{co} \cdot c_{t-1} + b_o)$$

17      
$$c_t = f_t \cdot c_{t-1} + i_t \cdot \sigma(W_{pc}pt + W_{hc}h_{t-1} + b_c)$$

18      
$$h_1 = o_1 \cdot \sigma(c_1)$$

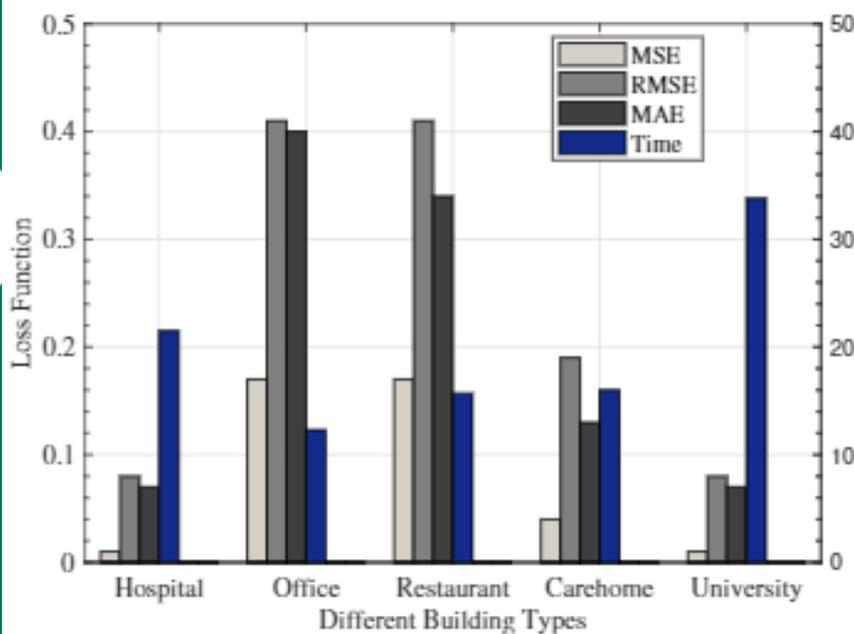
19    end
20    
$$\hat{y} = \sigma(W_y h_t + b_y)$$

21    
$$\bar{d}_i^k = \sum_j w_{ji}^k - 1(\sigma(\hat{y}_i^{k-1}) + b_i^{k-1})$$

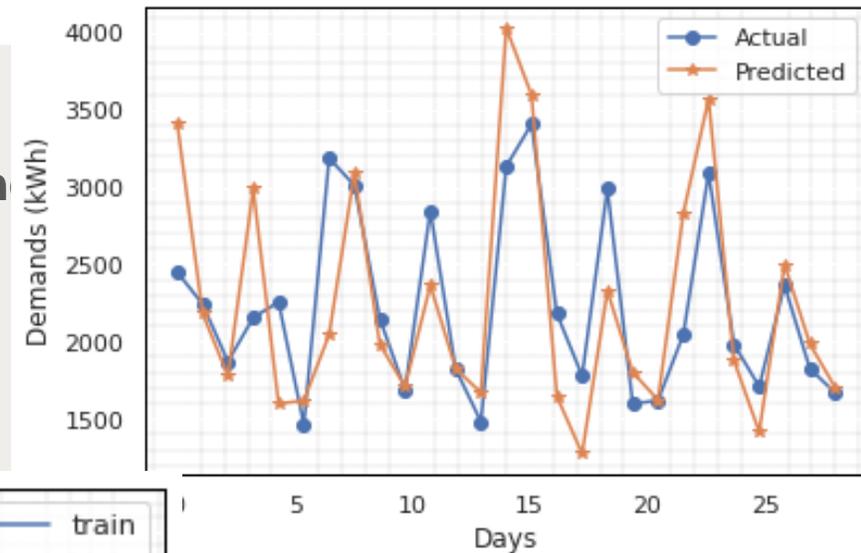
22  end
23   $d = \{\bar{d}\}$ 

```

# Results



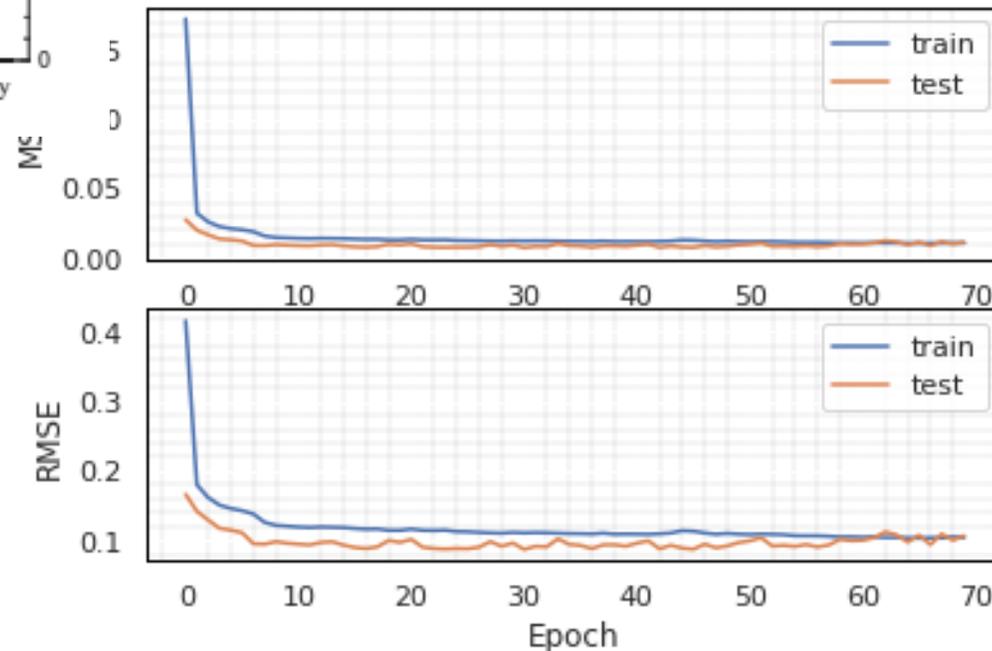
- To show the skilfulness of the proposed solution
- Training and validation loss for MSE and RMSE
- MSE of 0.01, RMSE of 0.09



## Different Energy dataset

Increase in length of data result in

- Increase in computation time
- Decrease in measured loss



## Actual and predicted

- To illustrate the predictive fit with actual data
- A months' prediction showing good fit

## Training and validation loss

Jogunola, O., & Adebisi, B., Hoang, K. V., Tsado, Y. & Popoola, S. I. (2021). CBLSTM-AE: A Hybrid Deep Learning Framework for Predicting Energy Consumption. IEEE Internet of Things (under review).

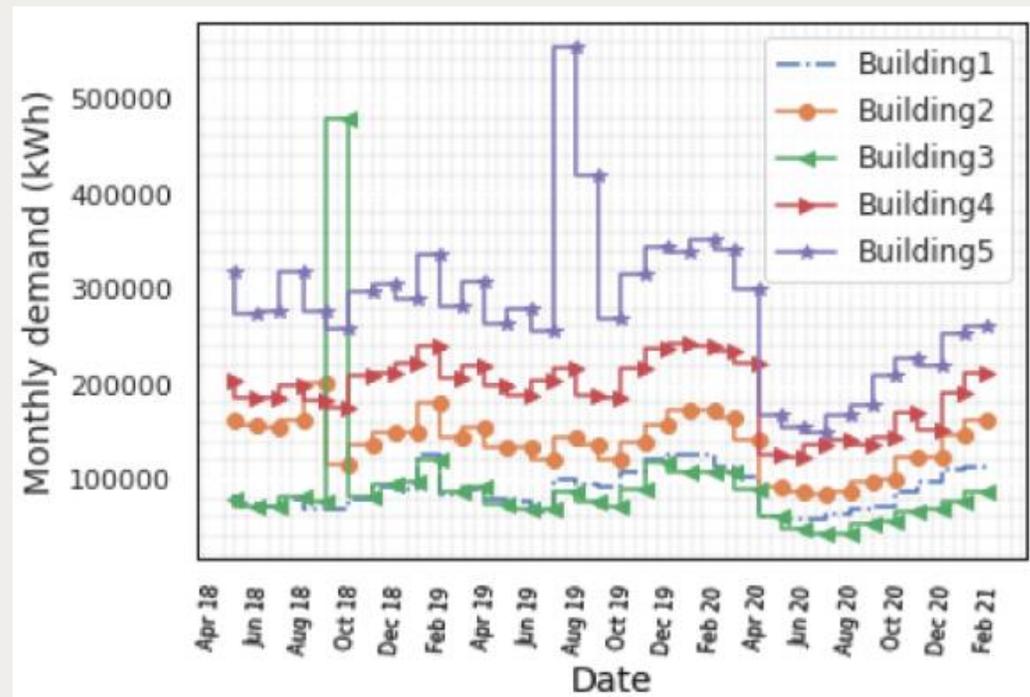
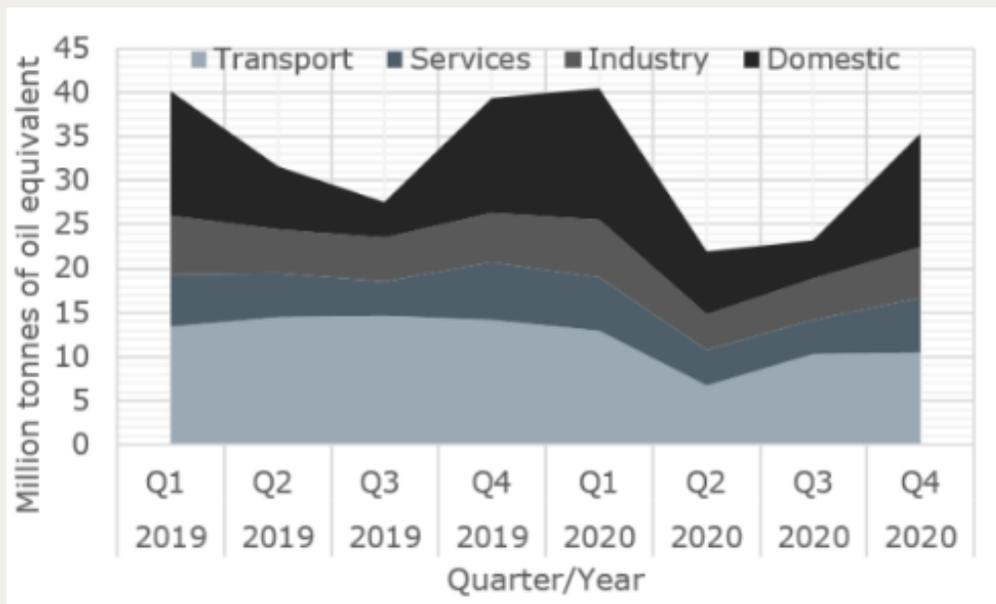
# Post-Covid energy consumption forecasting

Aim: To answer the key question of what commercial energy and occupancy patterns be in a post-covid world and its impact on smart energy service landscapes

Methodology: Review and predictive analysis

Sample energy data for 5 commercial buildings

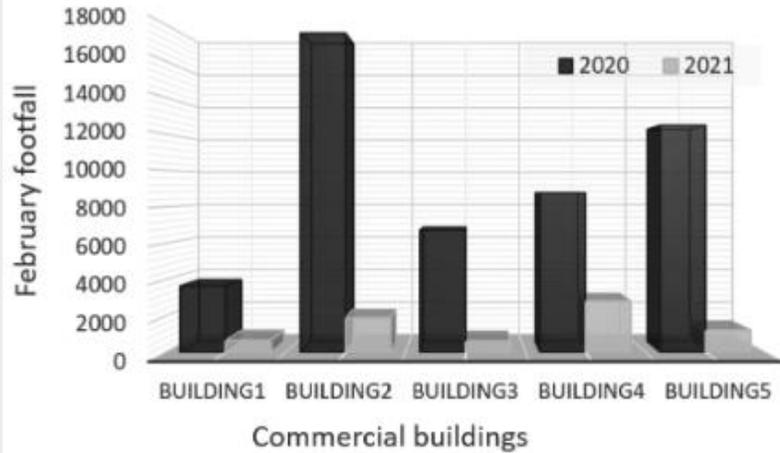
BEIS: UK Energy consumption by sector



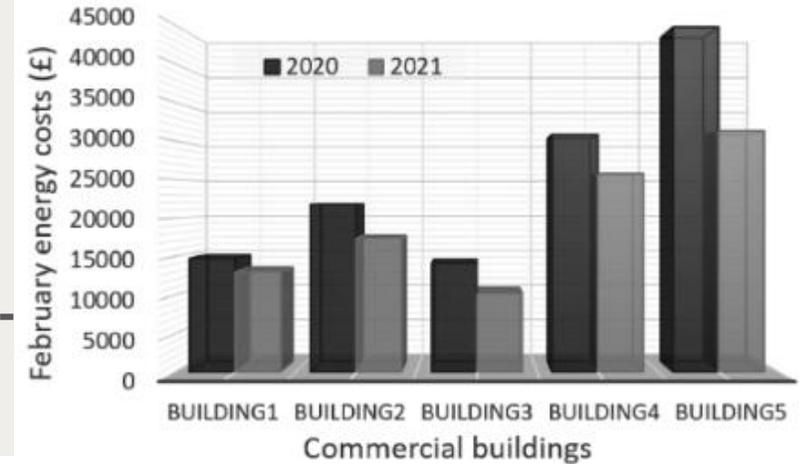
Result: To inform policy on energy and intervention towards net-zero carbon, costs savings

Jogunola, O., Morley, C., Akpan, I. J., Tsado, Y., Adebisi, B., & Yao, L. (2022). Energy consumption in commercial buildings in a post-covid-19 world. *IEEE Engineering Management Review*, 50(1), 54-64.

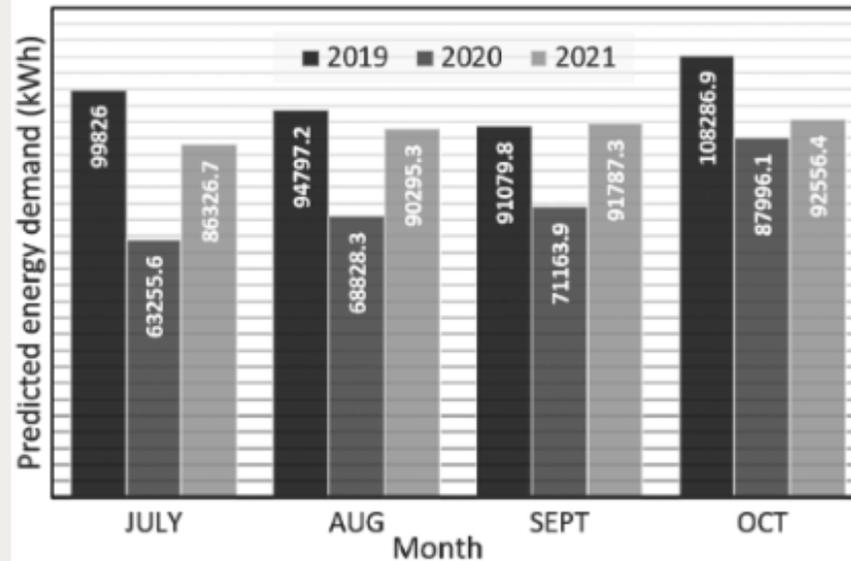
# Results



- 2021 higher than 2020 and 2019
- 29%, 38%, 45%, 37% higher than covid
- 8%, 19%, 39%, 1% higher than pre-covid



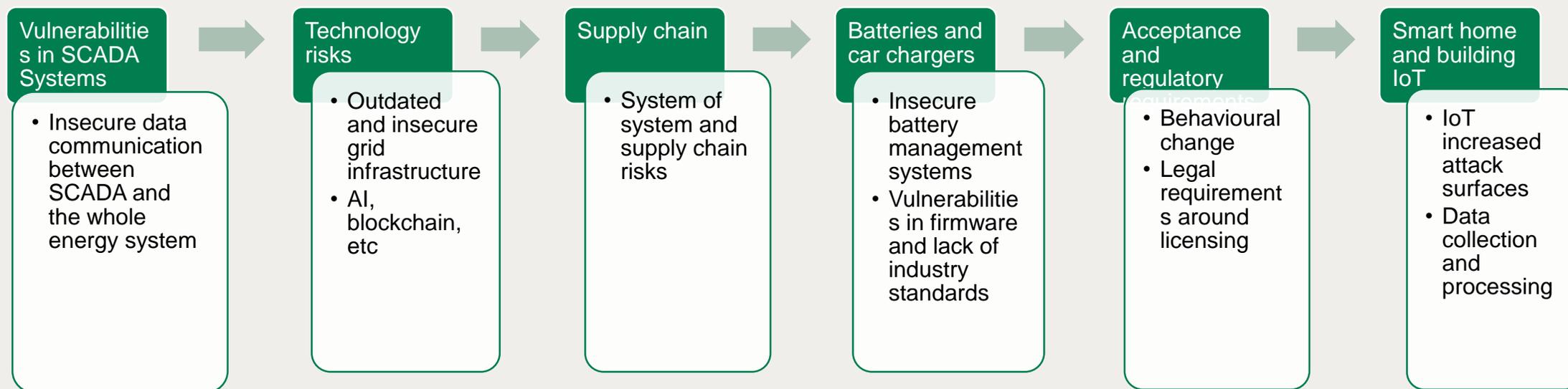
February occupancy: Average of 10% of 2020 footfall



4-month energy prediction for building 1

February costs: Average of 80% of 2020 costs

# Security, risks and uncertainties to Energy Transition



RUSI (2022), Securing a Net-zero Future. Available <https://static.rusi.org/305-EI-Cyber-Risks.pdf>

Yuan, H., & Li, S. (2022, June). Cyber Security Risks of Net Zero Technologies. In *2022 IEEE Conference on Dependable and Secure Computing (DSC)* (pp. 1-11). IEEE.

**Jogunola, O.**, Ajagun, A. S., Tushar, W., Olatunji, F. O., Yuen, C., Morley, C., ... & Shongwe, T. (2024). Peer-to-Peer Local Energy Market: Opportunities, Barriers, Security and Implementation Options. *IEEE Access*.

# Cyber Security Threats to Energy Transition

IOT SECURITY

## Hackers Earn \$1.3M for Tesla, EV Charger, Infotainment Exploits at Pwn2Own Automotive

Participants have earned more than \$1.3 million for hacking Teslas, EV chargers and infotainment systems at Pwn2Own Automotive.



By Eduard Kovacs  
January 26, 2024

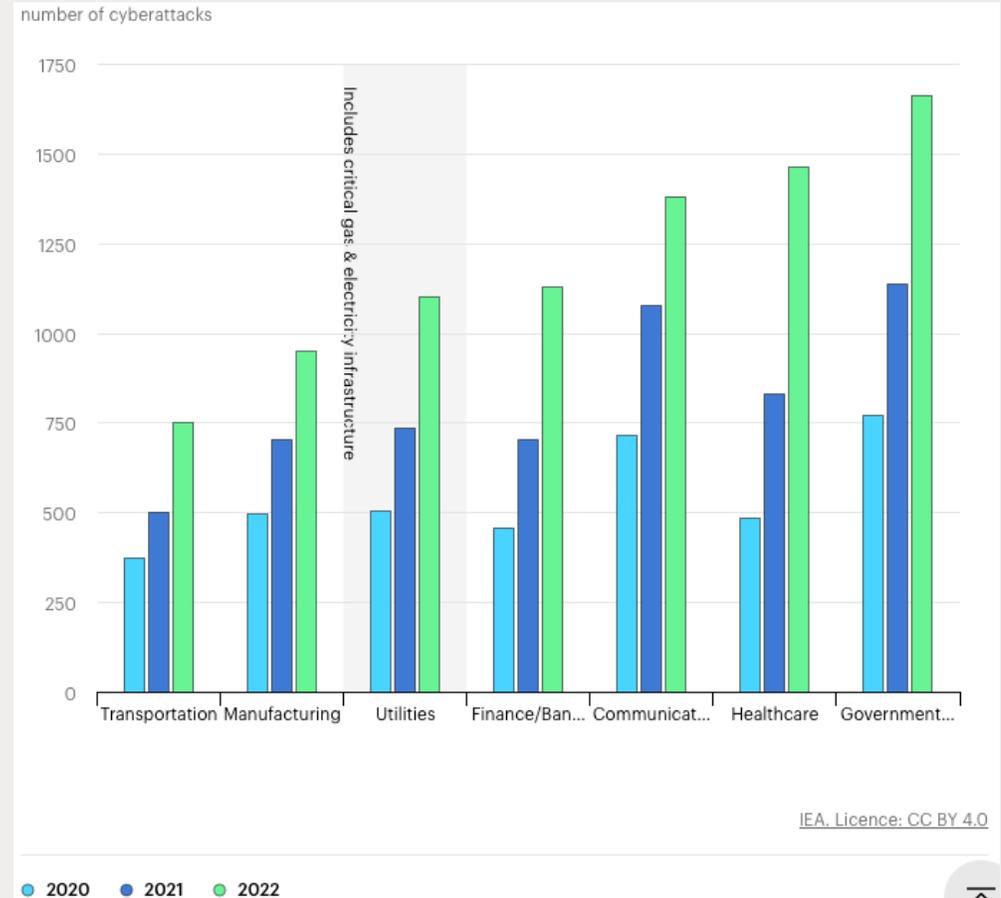


Home / News / "Top Python Developers Hacked In Sophisticated Supply Chain Attack"

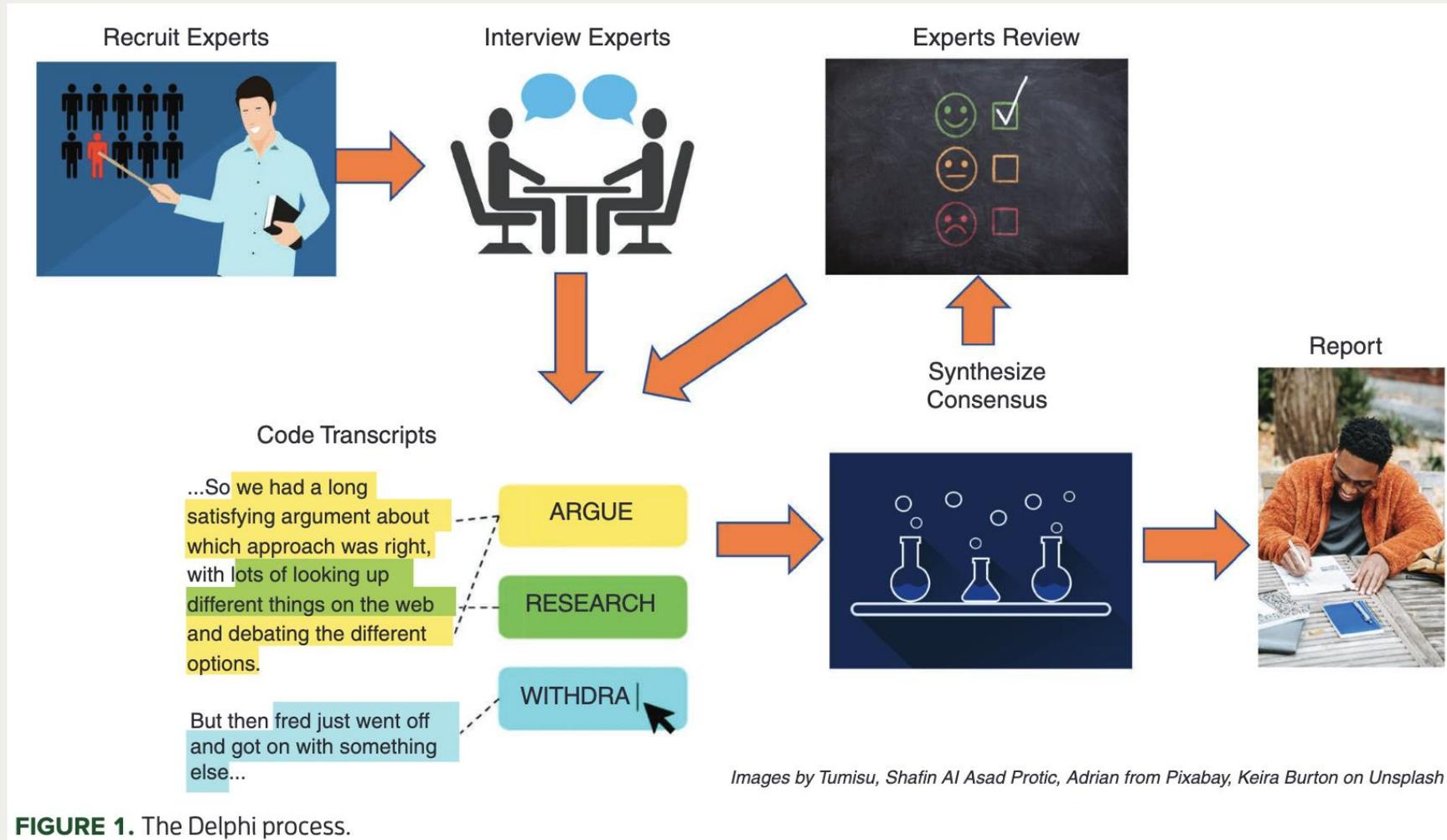
## "Top Python Developers Hacked in Sophisticated Supply Chain Attack"

Checkmarx reports that multiple Python developers, including a Top.gg maintainer, were infected with information-stealing malware after downloading a malicious clone of a popular tool. Colorama, a tool that makes ANSI escape character sequences work on Windows. has over 150 million monthly downloads. The

The average number of weekly cyberattacks per organisation in selected industries



# Cyber Security – Interlinked Computing: System of System Security



C. Weir, A. Dyson, **O. Jogunola**, L. Dennis and K. Paxton-Fear, "Interlinked Computing in 2040: Safety, Truth, Ownership, and Accountability," in *Computer*, vol. 57, no. 1, pp. 59-68, Jan. 2024, doi: 10.1109/MC.2023.3318377.

# Future outlook – Interlinked computing

TABLE 2. Agreement with statements.

| Forecast                                  | P3    | P4    | P5    | P6    | P7    | P8    | P9    | P10   | P11   | P12   | P13   | P14   |
|---|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| F1  | Blue  |
| ... leading to a megadeath incident       | White | Blue  | Amber | White | Amber | Amber | Amber | Blue  | Amber | Amber | White | White |
| ... due to regulatory capture             | Blue  | White | Blue  |
| ... which has developed exponentially     | Amber | Blue  |
| F2  | White | Blue  | Amber | White | Amber | White | White | White | Blue  | Amber | Blue  | Amber |
| F3  | Blue  | White | Blue  | White | Blue  |
| F3  | White | Blue  | White | Blue  | White |
| F5  | Blue  | White | Blue  | White | White | White | Blue  | Amber | White | Amber | Blue  | Blue  |
| ... systems beyond human understanding    | Blue  | White | Blue  | Amber | Blue  | White | Blue  | Blue  | Blue  | Blue  | Blue  | White |
| ... with more accidents due to complexity | Blue  | Blue  | White | White | Amber | White | Blue  | Amber | White | Blue  | White | Blue  |

Blue: agree; white: no opinion or unsure; amber: disagree.

C. Weir, A. Dyson, **O. Jogunola**, L. Dennis and K. Paxton-Fear, "Interlinked Computing in 2040: Safety, Truth, Ownership, and Accountability," in *Computer*, vol. 57, no. 1, pp. 59-68, Jan. 2024, doi: 10.1109/MC.2023.3318377.

Thank You!

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**cigre**

For power system expertise



**cigre**

Next Generation  
Network