

## **OVERVIEW OF SUSTAINABLE AND CIRCULAR ELECTRONICS**

Yannick Le Moullec Thomas Johann Seebeck Department of Electronics School of Information Technologies <a href="mailto:yannick.lemoullec@taltech.ee">yannick.lemoullec@taltech.ee</a>

- Presentation partly based on
  - "Overview of Sustainable and Circular Electronics", Draft V1.0, 15 December 2024 (Available on request)
  - Hands-on extracted from
    - IEE2520 Software Defined Electronics course

This work has received support from the Estonian Research Council, Project TEM-TA138 Sustainable Artificial Internet of Things (SAIoT)





Overview of Sustainable and Circular Electronics

Draft V1.0

15 December 2024

Yannick Le Mouliec (yannick.lamoullec@tatlech.ee)

Alar Kuusik (atar kuusik@tatlech.ee)

Thomas Johann Seebeck Department of Electronic School of Information Technologies Tailinn University of Technology Tailinn, Estonia

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- Introduction: The Scale of the Challenge
- Key Trends Shaping Sustainable Electronics
- Stakeholder Ecosystem and Regulatory Landscape
- Technologies and Industry Initiatives
- Batteries in Sustainable Electronics (Brief Overview)
- Future Directions and Roadmaps
- Hands-on with the MaixCam board

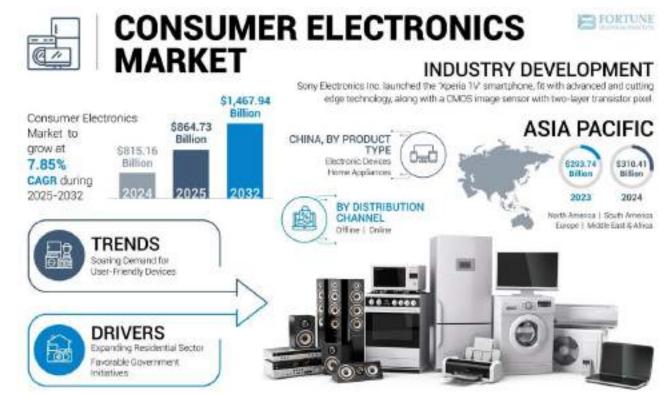


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### THE ELECTRONICS EXPLOSION

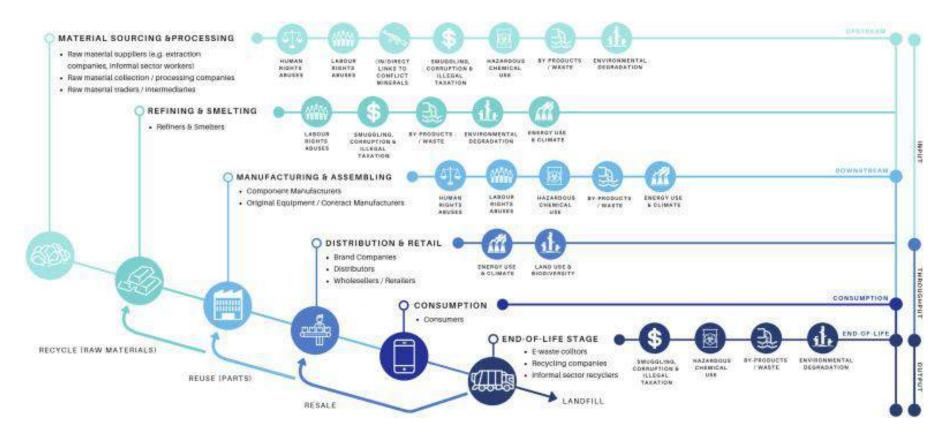
- From 1.3 electronic devices per American household in 1970...
- ...to 11 devices per household in 2020
- Global proliferation following similar patterns
- Accelerating consumption in emerging economies



https://www.fortunebusinessinsights.com/infographics/consumer-electronics-market-104693



### **ELECTRONICS GLOBAL VALUE CHAIN – SUSTAINABILITY RISKS**



"Infographic showing the main actors and sustainability risks relating to the electronics lifecycle and their position within various stages of the electronics global value chain"



Evans, R., & Vermeulen, W. J. V. (2021). Governing electronics sustainability: Meta-evaluation of explanatory factors influencing modes of governance applied in the electronics value chain. *Journal of Cleaner Production*, *278*, 1-16. Article 122952. <a href="https://doi.org/10.1016/j.jclepro.2020.122952">https://doi.org/10.1016/j.jclepro.2020.122952</a>

### **ENVIRONMENTAL AND SOCIAL IMPACTS**

- Resource depletion: critical raw materials with limited supplies
- Toxic pollution: heavy metals, flame retardants, other chemicals
- Energy consumption: manufacturing and usage phases
- Social impacts: unsafe working conditions in extracting and recycling
- Health hazards: improper e-waste handling







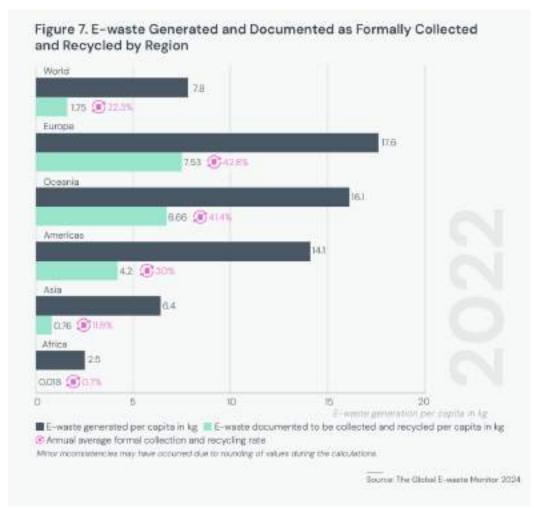
### **EXAMPLE: THE E-WASTE CHALLENGE**

- Source UN report cited in the document (p.8). This is equivalent to throwing away 800 laptops every second.
- Global e-waste increased 21% between 2014-2019
- Reached 53.6 million metric tons globally
- Projection: 74 Mt by 2030
- Only approx. 20% properly collected and recycled

United Nations, "Global E-Waste Surging: Up 21% in 5 Years | United Nations University." Accessed: Dec. 15, 2024. [Online]. Available: <a href="https://unu.edu/pressrelease/global-e-waste-surging-21-5-years">https://unu.edu/pressrelease/global-e-waste-surging-21-5-years</a>

VTT Technical Research Centre of Finland, "VTT Study: Environmental impact of flexible | VTT News." Accessed: Dec. 15, 2024. [Online]. Available: <a href="https://www.vttresearch.com/en/news-and-ideas/vtt-study-environmental-impactflexible-electronics-can-be-reduced-almost-90">https://www.vttresearch.com/en/news-and-ideas/vtt-study-environmental-impactflexible-electronics-can-be-reduced-almost-90</a>





https://ewastemonitor.info/electronic-waste-rising-five-times-faster-than-documeted-e-waste-recycling-un/

#### THE URGENCY OF ACTION

### **Key Milestones:**

- 1970s: Growing environmental awareness begins
- 1992: Energy Star Program launched
- 2003: RoHS Directive introduced
- 2007: E-Waste Recycling Programs emerge
- 2015: Paris Agreement influences tech company commitments
- 2020-Present: Accelerating regulatory and industry response



Example: battery recycling regulations in the EU Su, D.; Mei, Y.; Liu, T.; Amine, K. Global Regulations for Sustainable Battery Recycling: Challenges and Opportunities. Sustainability 2025, 17, 3045. <a href="https://doi.org/10.3390/su17073045">https://doi.org/10.3390/su17073045</a>



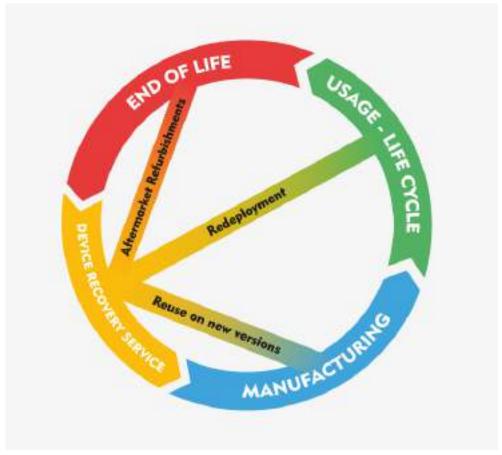
### **DEFINING CIRCULAR ELECTRONICS**

### **The Circular Approach**

- Design for longevity, repairability, and recyclability
- Keep products and materials in use for as long as possible
- Regenerate natural systems
- Eliminate waste and pollution

### From IEEE and European Parliament

"The concept of a circular economy encompasses the practices of sharing, leasing, reusing, repairing, refurbishing, and recycling existing materials and products."



https://retronix.com/component-reclaim-circular-economy/



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#### **8 Trends Shaping the Future of Sustainable Electronics**

#### 1. Sustainability Merging with Geopolitics

- Critical raw materials (CRM) becoming national security issue
- European Green Deal connecting sustainability to strategic autonomy
- Resource dependencies complicating low-carbon transition
- Sustainability now a key business concern due to geopolitical implications

#### 2. EU as a Global Regulator

- "The Brussels Effect" EU regulations influence global markets
- Strong sustainability regulations setting worldwide standards
- Companies adapting to meet EU requirements regardless of home country
- Importance of monitoring EU policies for future developments

# Mining rare-earth materials How aeography compromises the green tech revolution Global rare-earth production and reserves (2021) Minu production in tons Percentage of world total mine production. Percentage of world total reserves Rare-earth production Methodology: Data for metric tons of rare-earth-oxide equivalent content.

State of the State of Chicago Chicago Chicago Chicago Company Special Security Chicago Chicago

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#### **8 Trends Shaping the Future of Sustainable Electronics**

#### 3. Increasing Tracking and Transparency

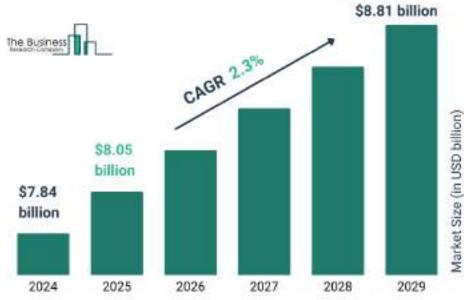
- European Corporate Sustainability Reporting Directive driving change
- Digital tools (IoT, blockchain) enabling detailed product tracking
- Enhanced information sharing throughout supply chain
- Consumers demanding visibility into product origins and impact

#### 4. Advancement of Circular Economy

- Europe leading in circular practices for electronics
- Modular design enabling longer product life
- Growing repairability movement
- Booming second-hand market driven by sustainability concerns

# TAL TECH

### Consumer Electronics Repair and Maintenance Global Market Report 2025



https://www.thebusinessresearchcompany.com/report/consumer-electronics-repairand-maintenance-global-market-report

#### **8 Trends Shaping the Future of Sustainable Electronics**

#### 5. Proliferation of Electronics in Products

- Electronics increasingly integrated into everyday items
- Advances in semiconductors and batteries driving miniaturization
- Rising concerns about new sources of e-waste
- Need for circular business models for "smart" products

#### 6. New Ownership Models

- Subscription, leasing, sharing challenging traditional ownership
- Digital technology enabling flexible access models
- Alignment with modern lifestyles prioritizing access over ownership
- Questions about responsibility for reuse and recycling



#### **8 Trends Shaping the Future of Sustainable Electronics**

#### 7. Al's Role in Transition

- Generative AI enhancing efficiency across industries
- Al improving electronics materials recovery
- Advanced sorting and disassembly using AI
- Robotics becoming more flexible for recycling operations

#### 8. Consumer Demand Evolution (really?)

- Younger generations favoring brands with ethical values
- "Comfortable sustainability" eco-friendly but convenient
- Consumers unwilling to sacrifice functionality for sustainability
- Complex decision-making balancing multiple priorities





"AI Powered High-Precision Metrology Drives Intelligent Disassembly of Electronics for Remanufacturing and Recycling"

https://metrology.news/ai-powered-high-precision-metrology-drives-intelligent-disassembly-of-electronics-for-remanufacturing-and-recycling/

# Question to the audience: which trend do you think has the most potential for positive impact?

- 1. Sustainability-Geopolitics Connection?
- 2. EU Regulatory Influence?
- 3. Tracking & Transparency?
- 4. Circular Economy Advancement?
- 5. Proliferation of Electronics in Products?
- 6. New Ownership Models?
- 7. AI Applications?
- 8. Evolving Consumer Demand?



#### **Circular Electronics in Practice**

Example: Fairphone

Approach: modular smartphone design, ethically sourced

materials, repair-focused

#### Claimed results:

- 53% reduction in CO<sub>2</sub> equivalent emissions vs industry average
- 5+ years of software support
- 1.7 million phones kept in use longer through repair program
- Fair materials sourcing benefiting mining communities



https://www.fairphone.com/fr/2023/08/30/is-the-fairphone-5-the-most-sustainable-phone-in-the-world/



### **Challenges Ahead**

#### **Obstacles to Implementing Sustainable Electronics**

- Complex global supply chains with limited transparency
- Economic pressure for rapid product cycles
- Consumer expectations for constant innovation
- Technical limitations for recycling processes
  - "Manual" approaches: risks for human health, ethics
- Market fragmentation hindering standardization
- Legacy systems and compatibility requirements



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#### **Regulatory Timeline**

#### **Evolution of Electronics Regulations**

- 1990s: First voluntary initiatives
- 2000s: Initial mandatory requirements (RoHS, WEEE)
- 2010s: Expansion of scope and substances covered
- 2020s: Shift toward circular economy and whole-lifecycle approach
- 2030s: Projected integration of digital tracking and full transparency

**Trend:** Increasing stringency and comprehensive coverage



#### **Certification Bodies**

#### **Some Key Certification Organizations**

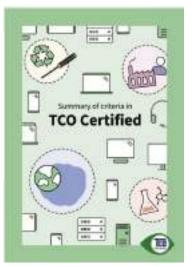
- TCO Certified: Sustainability certifications for IT products (3500+ certified products from 25 brands)
- Energy Star: Energy-efficient product certification (saved 430 billion kWh in 2019)
- Cradle to Cradle: Circular economy principles certification (600+ companies across 54 countries)

Impact: Drive manufacturer adoption of sustainable practices through market recognition











#### **Examples of International Organizations**

#### **Global Organizations Driving Sustainability**

- IPC (Association Connecting Electronics Industries):
   Standards adopted by 3000+ member companies
- ITU (International Telecommunication Union): Global standards for sustainable telecommunications
- UNEP (UN Environment Programme): Solving the Ewaste Problem (StEP) Initiative
- GEC (Global Electronics Council): EPEAT ecolabel with 4,400+ registered products

#### Sustainability Leaders: Taking Charge of Solutions



IPC Sustainability for Electronics Council – made up of EMS, OEM, and PCB industry leaders, the group serves as a resource for associates in creating "standards, education, workforce training, advocacy, industry intelligence and events" towards sustainability

Circular Electronics Partnership (CEP) – brings together "the biggest names in tech, waste management, and consumer goods" to work towards a circular economy

UN's International Telecommunications
Union (ITU) – 900 companies strong, an agency
for information and telecommunications
technologies (ICTs)

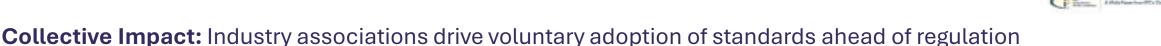
https://www.global-imi.com/blog/electronics-leaders-weigh-sustainability-challenges



#### **Industry Associations**

#### Some Industry-Led Sustainability Initiatives

- **RBA (Responsible Business Alliance):** 180+ companies representing 7.7 million workers
- ITI (Information Technology Industry Council): Policy advocacy for sustainable innovation
- iNEMI (International Electronics Manufacturing Initiative): Collaborative R&D consortium
- **IPC (Association Connecting Electronics Industries)**
- CTA (Consumer Technology Association): Annual CES showcasing sustainable technologies

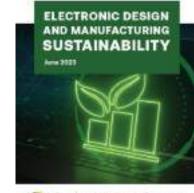
















#### **European Regulations**

#### **EU Regulatory Framework**

- WEEE Directive: Collection, recycling, and recovery targets for electrical goods
- RoHS Directive: Restricts 10 hazardous substances in electronics.
- ESPR (Ecodesign for Sustainable Products Regulation): Framework for sustainability requirements
- Digital Product Passport: Will store and make accessible sustainability information

Key Focus Areas: Durability, repairability, recycled content, carbon footprint, product information











#### **European Regulations**

Global Regulatory Landscape (examples, outside the EU)

#### **United States**

- EPEAT voluntary certification
- Energy Star Program (20-30% energy reduction in certified products)

#### China

- China RoHS restricting hazardous substances
- Unique labeling requirements and catalogue-based compliance

#### Japan

- Home Appliance Recycling Law covering TVs, air conditioners, refrigerators, washing machines
- 14.95 million units collected for recycling (2022)



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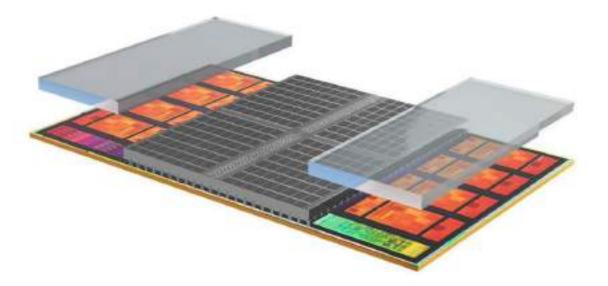
#### **Energy Efficiency Innovations**

#### **Advanced Power Management**

- Dynamic Voltage and Frequency Scaling (DVFS)
- Sleep states (C-states) and power states (P-states)
- Adaptive brightness control

#### **Component Efficiency**

- Smaller transistor sizes (5 nm, 3 nm processes)
- 3D chip stacking technology
- High-k metal gates reducing leakage current



https://spectrum.ieee.org/amd-3d-stacking-intel-graphcore



#### **Sustainable Materials Revolution**

#### **Bio-based Alternatives**

- Biopolymer-based printed circuit boards
- Organic semiconductors
- Mycelium-based packaging materials
- Cellulose-based composites

#### **Recycled Content**

- Post-consumer recycled (PCR) plastics
- Closed-loop recovery systems
- Advanced sorting technologies using AI

#### **Reduced Dependence on Rare Materials**

- Ferrite magnets as alternatives to neodymium
- Organic light-emitting diodes (OLEDs)
- Engineered nanomaterials





https://newatlas.com/materials/vitrimer-recyclable-printedcircuit-board/

#### **Circular Design Principles**

#### **Modular Design**

- Easily replaceable components
- Standardized connectors and interfaces
- Software support for component hot-swapping

#### **Design for Disassembly**

- Reversible fasteners instead of adhesives
- Clear material labeling for identification
- Avoiding difficult-to-separate composite materials

#### **Repairability Features**

- Accessible internal components
- Available repair documentation
- Spare parts availability





https://thenextweb.com/news/fairphone-user-repairable-wireless-headphones

#### **Advanced Recycling**

#### **Next-Generation Technologies**

- Bioleaching: Using microorganisms to extract metals
- Supercritical water oxidation for breaking down hazardous compounds
- Automated disassembly using robotics and Al

#### **Recovery Improvements**

- Precious metals recovery rates increasing from 30% to 95% (target, not there yet)
- Rare earth element extraction from electronic waste
- Carbon footprint reduction in recycling processes



#### **Green Manufacturing**

#### **Additive Manufacturing**

- Aerosol Jet Printing for electronics circuits
- Stereolithography (SLA) for PCBs
- Selective Laser Sintering (SLS) for conductive components

#### **Safer Chemicals**

- Water-based cleaning systems replacing organic solvents
- Supercritical CO<sub>2</sub> cleaning
- Plasma cleaning without chemicals

#### **Energy-Efficient Processes**

- Advanced thermal management
- IoT-enabled smart manufacturing grids
- Digital Twin simulation for optimization



#### **Industry Initiatives**

#### **Collaborative Industry Programs**

- IPC Sustainability Policy Priorities focusing on chemical and product policies
- RBA Code of Conduct implemented throughout supply chains
- iNEMI collaborative research projects for eco-design
- Circular Electronics Partnership uniting leaders across the value chain

#### **Industry Commitment**

- Certification and validation programs
- Workforce training in sustainable practices
- Knowledge-sharing platforms
- Pre-competitive collaboration on common challenges



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# **BATTERIES IN (SUSTAINABLE) ELECTRONICS**

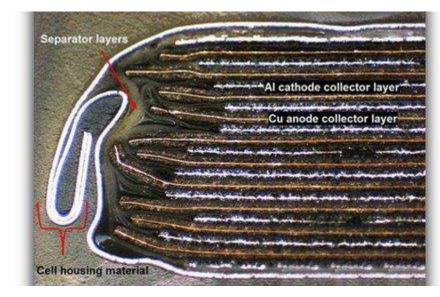
#### **Battery-Electronics Intersection**

#### **Sustainability Challenges**

- Batteries often determine overall product lifespan
- Resource-intensive materials (lithium, cobalt, nickel)
- Energy-intensive manufacturing
- End-of-life processing difficulties

#### **Emerging Solutions**

- Solid-state batteries with higher energy density
- Silicon anodes increasing storage capacity
- Lithium-sulfur batteries as next-generation technology
- Design innovations for easier battery replacement



https://www.ifixit.com/News/10990/your -smartphone-battery-explained



# **BATTERIES IN (SUSTAINABLE) ELECTRONICS**

#### **Battery Design Spectrum**

#### From Least to Most Sustainable

- Integrated Batteries: Permanently sealed, device disposed when battery fails
- Service-Replaceable: Replacement requires professional service
- User-Replaceable with Tools: Can be replaced by user with specific tools
- Standardized User-Replaceable: Common form factors, easily accessible

#### **TCO Certified Requirement:**

"Batteries must be user-replaceable with common tools or provided tools."

#### **Future Directions**

- Self-healing battery materials
- Biodegradable battery components
- Standardization initiatives

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## **LOOKING AHEAD**

## **iNEMI Roadmap Highlights**

- Materials innovation and substitution
- Design for sustainability and circularity
- Manufacturing process optimization
- End-of-life management technologies

### **Timeline**

- 2024-2026: Immediate priorities including PCB alternatives
- 2027-2030: Advanced recycling technologies
- 2030+: Closed-loop systems for all materials

## **Key Challenges**

- Complex material combinations
- Global supply chain management
- Legacy system compatibility



### Roadmap Topics

#### Complex Integrated Systems

Topic Co-chair: Francis Mullany (INEMI) Topic Contributors Contributing organizations: Bell Labs Consulting, Nokia; INEMI; Intel; IPC; Jabit; SEMI; Tejas Not.

#### Sustainable Electronics

Topic Co-chairs: Thomas Okrasinski (Nokia), Fu Zhao (Purtue University), Pla Tanokanen (Nokia) Topic Contributors Contributing organizations: IBM, Nokia, Pur...

#### mmWave Materials and Test

Topic Chair: Br. Umri Ray, INEM Topic Contributors Contributing organizations: INEMi, Intel. NIST, OWED, Keysight Technologies Acknowledgement Aspart of th...

#### Printed Circuit Board (PCB)

Topic Co-chairs: Tarja Rapara (EIPC), Joe Beers (Gold Circuit Electronics) Topic Contributors Contributing organizations: DuPont, EIPC, Four Peaks Innovation...

#### **Board Assembly**

Topic Co-chairs: Jastin Bath (Bath Consultancy LLC), Paul Wang (MITAC) Topic Contributors Contributing organizations: AMD, Bath Consultancy LLC, Collectics, F...

### Packaging & Heterogeneous Integration

This is a brief overview of the topic Packaging & Heterogeneous Integration. To avoid duplication, many links here point to specific sections in MAPT, the NL...

### Smart Manufacturing

Topic Co-chains Dan Gamota (Jabil), Ranjan Chatterjae (Cimetris) Topic Contributors Contributing organizations: Cimetrix, Jabil, Palo Alto Networks, SEMLK...

#### Roadmap Drivers

Under development. Orivers not specific to a given topic, but more related to an application area, are stored here. Full scale nametives and tables will be ...

#### Contributors to the INEMI Roadmap

The INEMI Roadmap depends on the voluntary efforts of a large number of contributors. On behalf of the electronics manufacturing industry, we in INEMI would ...

### Guide to the INEMI Roadmap

INEM Roadmap Taxonomy Color Coding Key for Technology Status Readiness Levels Technology Readiness Levels (TRLs) Manufacturing Readiness Levels (MRLs) Color.

# **LOOKING AHEAD**

#### TCO Roadmap Focus Areas and Goals:

#### Climate (2033)

- Verified emissions reductions
- Energy efficiency in supply chain
- Renewable energy through accredited purchases

#### Substances (2033)

- Safer alternatives in all high-risk categories
- Risk benchmarks covering multiple supply chain tiers
- System addressing emerging hazardous substance hotspots

#### Circularity (2033)

- 10+ years of supported product life
- Easy maintenance, repair, and reuse
- Digital product passports

#### Supply Chain (2033)

- Living wage for workers
- Water conservation near manufacturing
- Responsible sourcing of all risk minerals

Climate Substances Circularity Supply chain
Timeline 2024-2033

Steps we take 2024-2026



Reducing emissions from production



Reducing emissions from use

Scope 3 emission reductions beyond industry standards. IT brands are incentivized to implement emission-reduction activities that go beyond industry standards. Verified best practices are shared with other brands to speed up the pace of change.

Increasing the demand for renewable energy. To increase the amount of renewable energy produced, IT brands must purchase renewable electricity equivalent to 15% of their consumption in final assembly factories. Purchases must be made using accredited systems.

Reducing energy use further into the supply chain. We go beyond final assembly and require that display panel factories implement an energy management system certified to ISO 50001. Extending product life to 5+ years. To significantly reduce annual emissions, products must be designed for a longer lifespan and supported with a warranty and free security and functionality updates for at least five years.

Improving the energy efficiency of products. Products must meet the latest energy efficiency standards of Energy Star or equivalent.

Coming steps 2027-2032

https://tcocertified.com/roadmap/#climate

# **LOOKING AHEAD**

## **Skills Development**

"The urgency is clear: while the economy and society need these skilled professionals now, it will take 5-10 years for graduates with these new competencies to effect change." (INSA/Shift Project report)

## **Workforce Needs**

- Technical skills for repair and remanufacturing
- Design expertise for circular products
- Supply chain management for sustainability
- Data analytics for impact assessment

## **Educational Initiatives**

- Education in Sufficiency for Sustainable Electronics (ESOS) at INSA Rennes, France
- International Labor Organization (ILO) "Skills for a greener future" framework
- Industry-academia partnerships for curriculum development



# **CRITICAL REFLECTIONS**

### **The Rebound Effect**

## **Efficiency Paradox**

- Efficiency improvements lead to increased consumption
- Named after William Stanley Jevons (1865)
- Total impact = Impact per unit × Number of units × Usage intensity

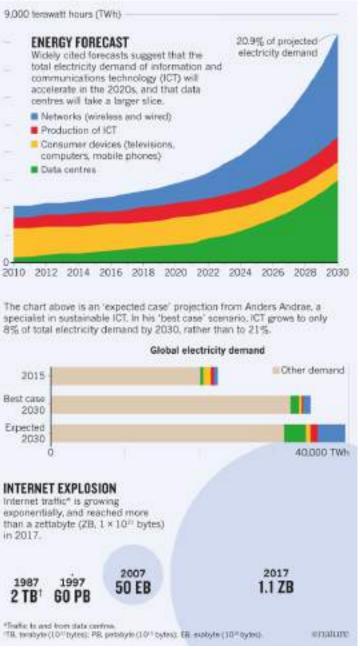
## **Electronics Examples**

- More energy-efficient devices → More devices in use
- Longer battery life → More screen time
- Cloud efficiency → More data storage and processing

## **Empirical Evidence**

- Global ICT energy use continues to rise despite efficiency gains
- Data centers 10x more efficient but total energy use still increasing





# CRITICAL REFLECTIONS

## **Additive Rather Than Substitutive Transitions**

## **Addition Problem**

- New technologies rarely fully replace old systems
- We add new layers of technology while maintaining legacy systems
- Digital and physical infrastructures coexist rather than substitute

## **Resource Implications**

- Critical raw materials demand accelerating
- New materials added to material footprint without reducing others
- Energy demand for digital systems adds to existing energy uses



## PRESENTATION OVERVIEW

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- Sustainability is not only about recycling or regulation. It's also about intelligent design choices
  - E.g. performing computations where they cost the least --in energy, latency, and carbon emissions
- Focus on edge devices and possible edge-layer, not fog-layer (e.g. not telecom infrastructure)
- Key idea: perform computations near the sensors, or even on the sensors
- Examples of boards (non-exhausive)



ESP32 series





RPI series
Possibly with HAT for accelerating machine learning (TPU: Tensor Flow Unit)



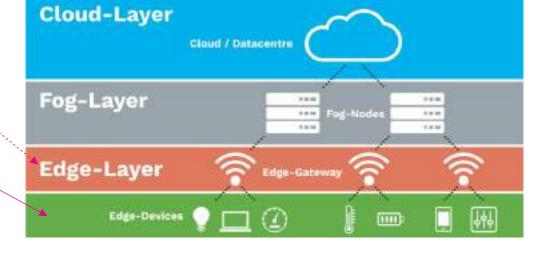
Luckfox series (includes NPU: Neural Processing Unit)



Maix series (includes NPU)



Nivia series (includes GPU)

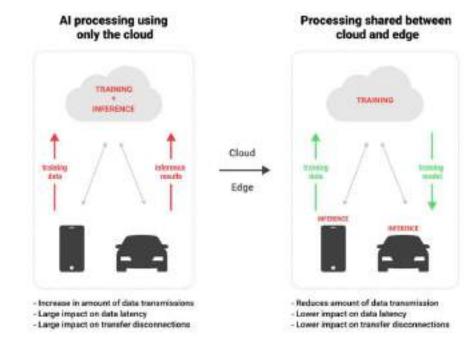


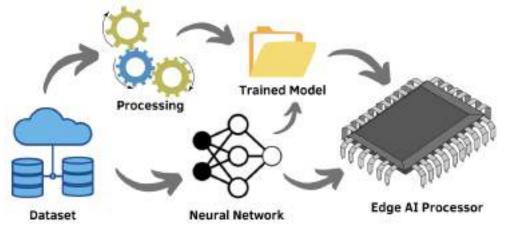
# ASPECTS OF EDGE COMPUTING FOR SOFTWARE DEFINED SENSING

### Machine learning on edge devices (also known as edge-AI)

- Primarily refers to inference conducted on edge devices
- Reduces rata transmission and cloud dependency
  - Lower carbon footprint by minimizing data movement to power-hungry data centers
- Real-Time, local decision making
  - Reduced latency and energy
- Low-Power AI Hardware
  - Reducing system-level energy use
- Training is (much) more compute demanding
  - Still mostly performed in the cloud, or local powerful PC with GPUs
  - However, increasing trend towards training, or at least partial training/updating on edge devices too







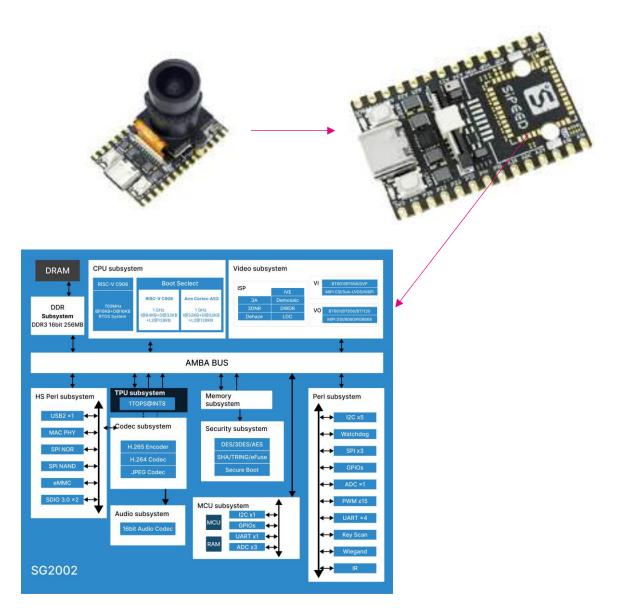
 $\frac{\text{https://embeddedcomputing.com/technology/iot/edge-computing/edge-ai-is-overtaking-cloud-computing-for-deep-learning-applications}{44}$ 

# ASPECTS OF EDGE COMPUTING FOR SOFTWARE DEFINED SENSING

### **Hardware example: MAIXCam**

- Based on a LicheeRV Nano module (SG2002 chip)
  - Primary 700 MHz RISC-V C906 core
  - Secondary, <u>boot-selectable</u>, 1 GHz RISC-V C906 core <u>or</u> 1 GHz ARM A53 core.
  - Tensor Processing Unit (TPU)
    - Up to 1 TOPS@INT8
  - 256 MB DDR3 memory
  - Up-to 2.5 W power consumption
  - Low-cost (approximately 34 EUR)





## **Objectives**

### Maixvision

AI vision IDE for programming, running code, live image preview, and graphical programming

## The objectives are to:

- Install Maixvision
- Configure it and connect to the MaixCam board
- Run some of the provided examples







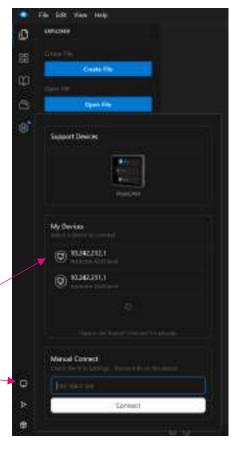
Note: we do not have the touchscreen/display module. We use the display in MaixVision instead.

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```

# **Setup (1/3)**

- 1. Install Maixvision
  - https://wiki.sipeed.com/en/maixvision.html
- Make sure the SD card is inserted in the MaixCam board
- 3. Connect the MaixCam board to the PC
- 4. In MaixVision: bottom left: click the computer monitor icon "Connect"
- 5. Select the first address
- 6. Verify that the connection was successful

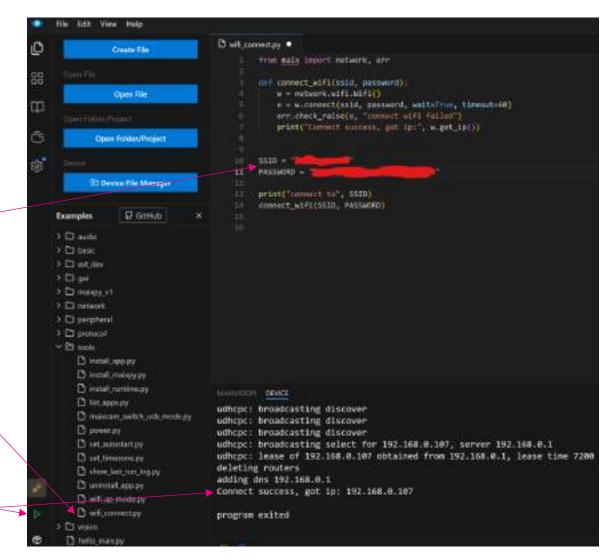




# Setup (2/3) Optional step

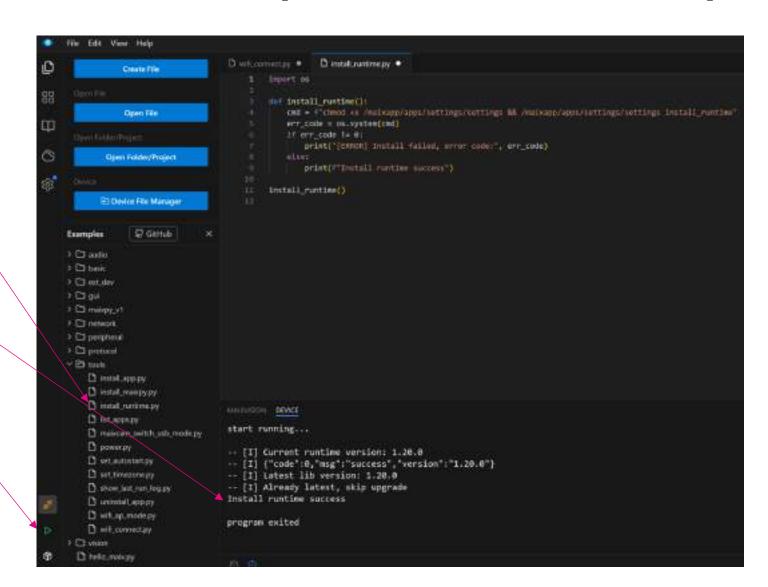
- 1. Click "Examples"
- Navigate to tools and click wifi\_connect.py
- 3. Configure as per the actual network:
  - Replace Sipeed\_Guest with the network SSID
  - Replace qwert123 with the network password
- 4. Run the code
- 5. Verify that the board got connected to the WiFi network





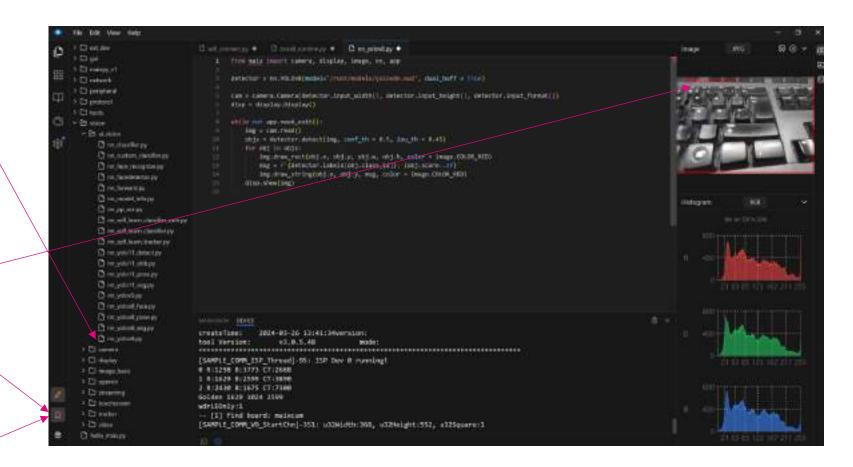
# **Setup (3/3)**

- Navigate to tools and click install\_runtime.py.
- 2. Run the code
- 3. Verify that the runtime was installed



## **Experiments**

- Navigate to ai\_vision and click nn\_yolov8.py
- 2. Remove the cap from the lens of the camera
- 3. Run the code
- 4. Check the results
  - 1. Adjust the camera's focus ring as needed
  - 2. Possibly, check the options of the histogram (LAB, RGB, etc.)
- 5. Press stop when you are done
- 6. Try other example(s)





# **THANK YOU!**

THIS WORK HAS RECEIVED SUPPORT FROM THE ESTONIAN RESEARCH COUNCIL, PROJECT TEM-TA138 SUSTAINABLE ARTIFICIAL INTERNET OF THINGS (SAIOT)

Yannick Le Moullec
Thomas Johann Seebeck Department of Electronics
School of Information Technologies
<a href="mailto:yannick.lemoullec@taltech.ee">yannick.lemoullec@taltech.ee</a>