

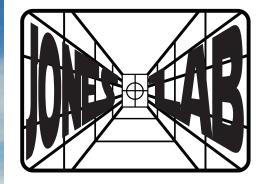
#### University of Pittsburgh

#### Collaborative AI at the Edge: IEEE Micro Magazine Jan/Feb 2023

#### Alex K. Jones

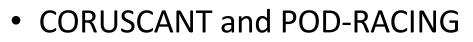
University of Pittsburgh akjones@pitt.edu





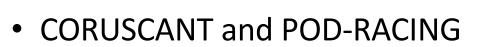
February 9, 2023

#### Outline



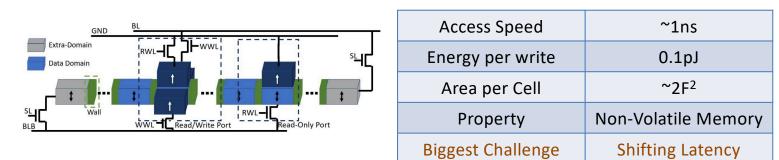
- Pretty cool Racetrack device
- Let's make it do PIM
- Sustainable Computing
  - We're at Post Moore crossroads
  - Let's make machines that address sustainability metrics

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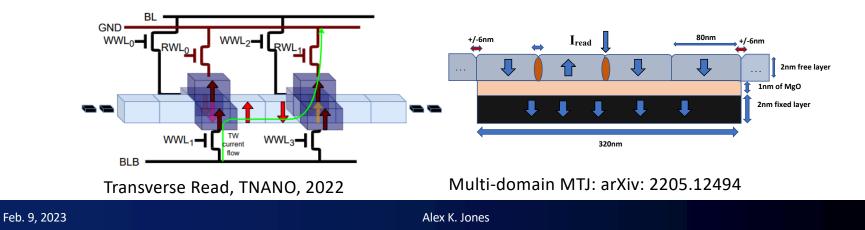
# Racetrack Memory and Multi-domain Read



TSBU

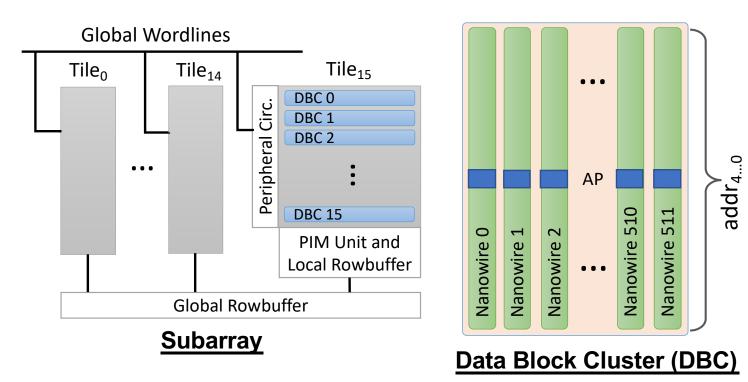
4

#### <u>Transverse read – Count the Number of 1's</u>



#### **DWM** Architecture





# CORUSCANT

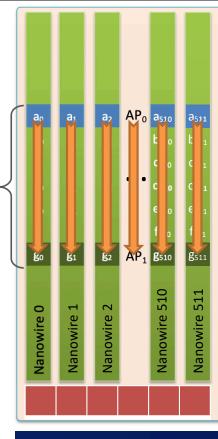
CORUSCANT –

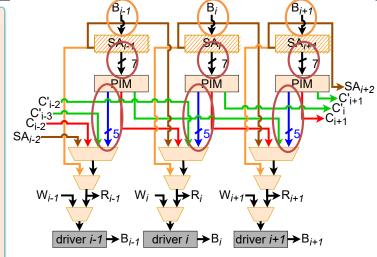
Computing Optimized Racetracks Using Specialized Clusters Accessing Nanowires Transversely Tansverse Read Distance

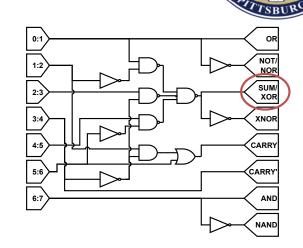
I anowire 1
Nanowire 1
Nanowire 2
Nanowir

#### Feb. 9, 2023

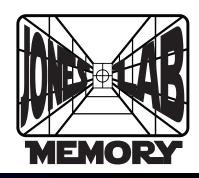
#### **CORUSCANT: Bulk Bitwise**







 $\mathbf{A} \oplus \mathbf{B} \oplus \mathbf{C} \oplus \mathbf{D} \oplus \mathbf{E} \oplus \mathbf{F} \oplus \mathbf{G}$ 

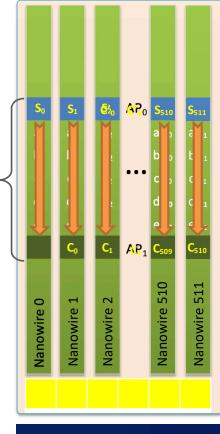


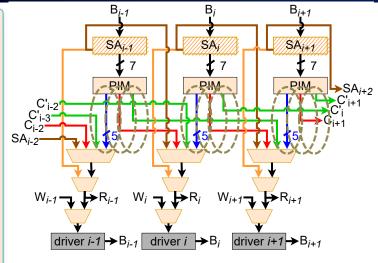
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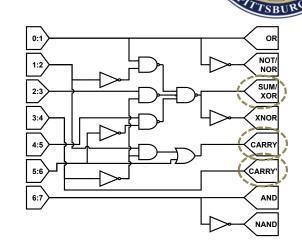
Feb. 9, 2023

**Transverse Read Distance** 

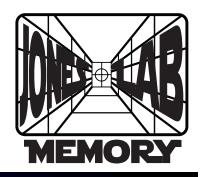
#### **CORUSCANT:** Addition







# A plus B plus C plus D plus E



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Feb. 9, 2023

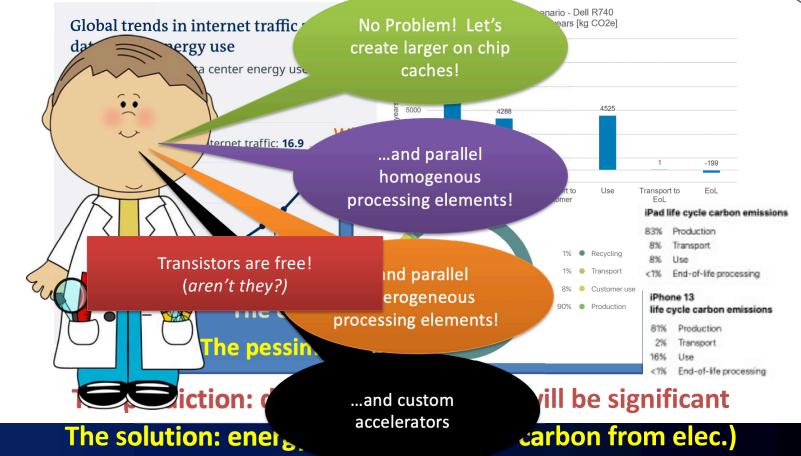
**Transverse Read Distance** 

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#### Articulating the Sustainability Problem





# Indifference Point Analysis

- Make Comparisons
  - Absolute evaluation is still hard
- Borrow from Economics

#### In the context of computing systems

•Time to amortize initial manufacturing investment

Indifference Analysis:

Time  $(t_i)$  when there is no difference in cost between two alternatives

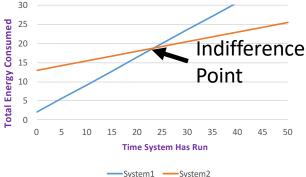
Break Even Analysis:

Time  $(t_B)$  when new system will reach the same energy consumption of the system it will replace

$$t_{I} = \frac{M_{1} - M_{0}}{P_{0} - P_{1}} \qquad t_{B} = \frac{M_{1}}{P_{0} - P_{1}}$$

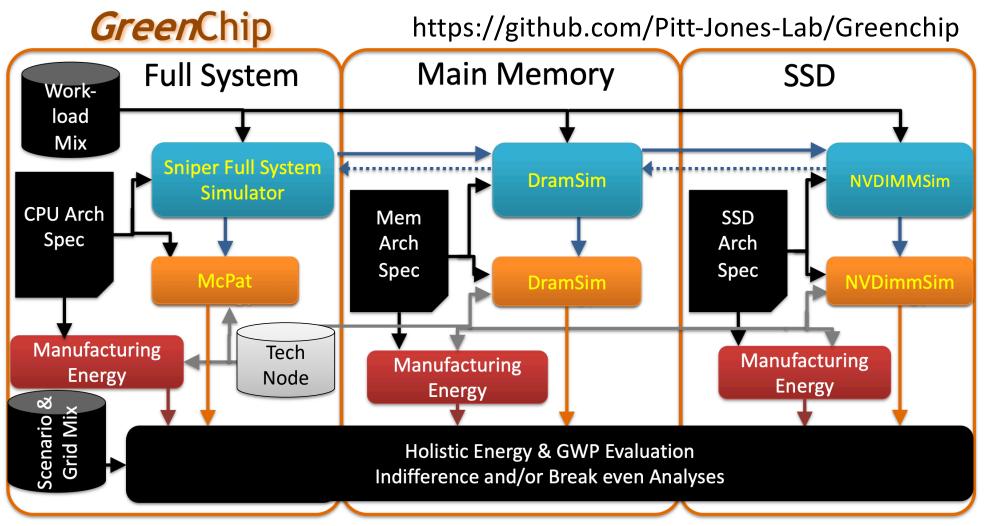


**Energy & GWP** 





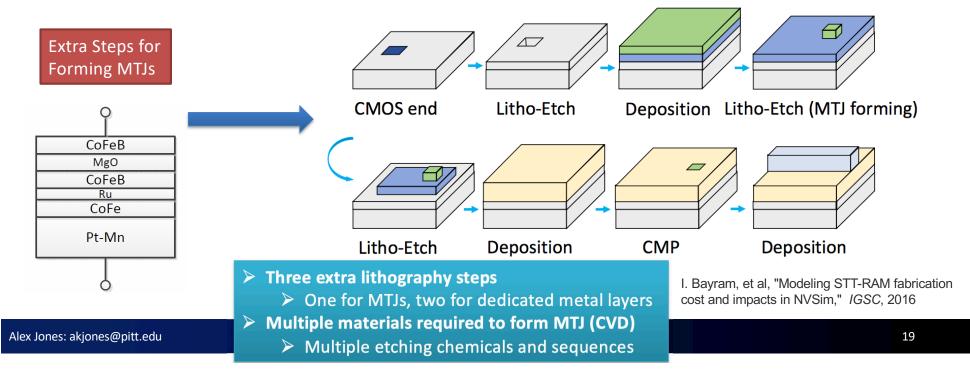
$$t_I = t_B - \frac{M_0}{P_0 - P_1}$$



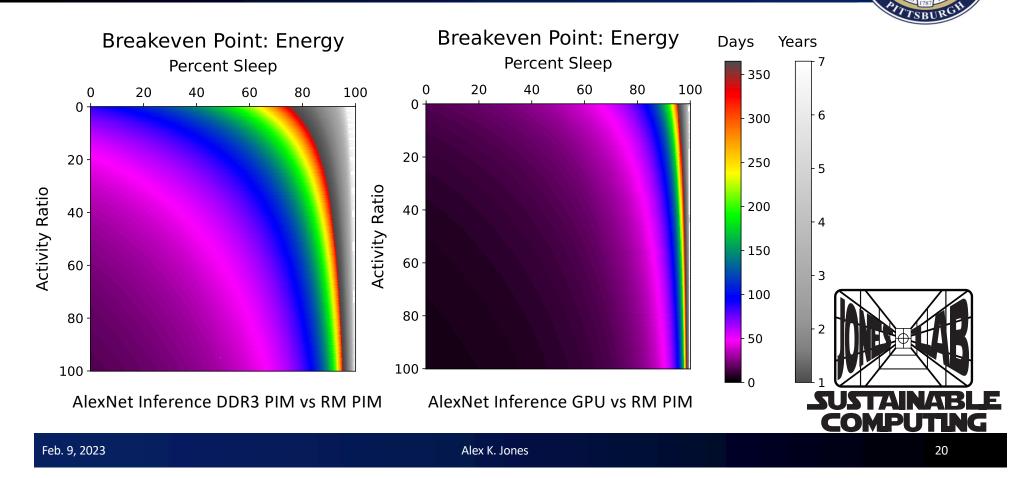
D. Kline, et al., "GreenChip: A tool for evaluating holistic sustainability of modern computing systems," *Sustainable Computing: Informatics and Systems*, Vol. 22, 2019, pp. 322-332, https://doi.org/10.1016/j.suscom.2017.10.001

# Extending NVSim with Sustainability Metrics

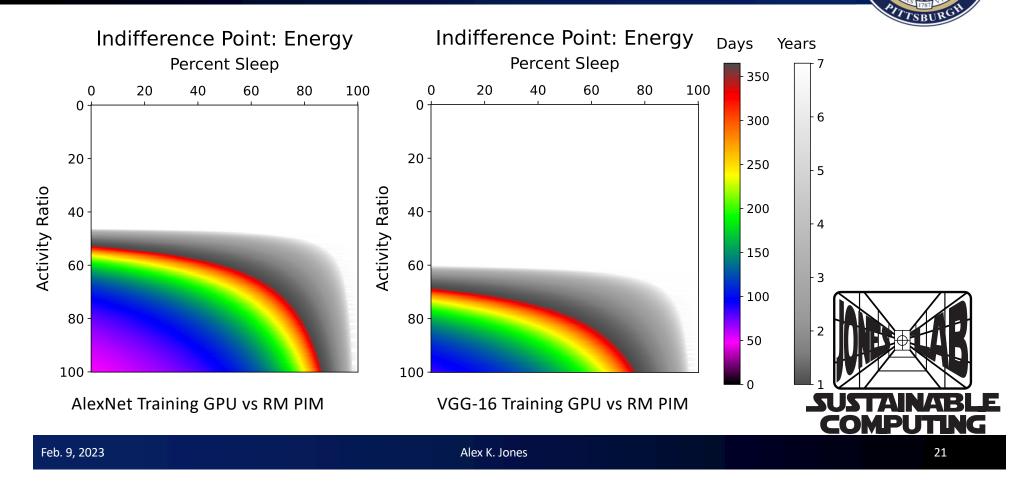
- NVSim: area/perf/use-phase energy estimates for SRAM and NVMs
- Combine with parameterized model to determine cost and environmental impact data for arbitrary memory design



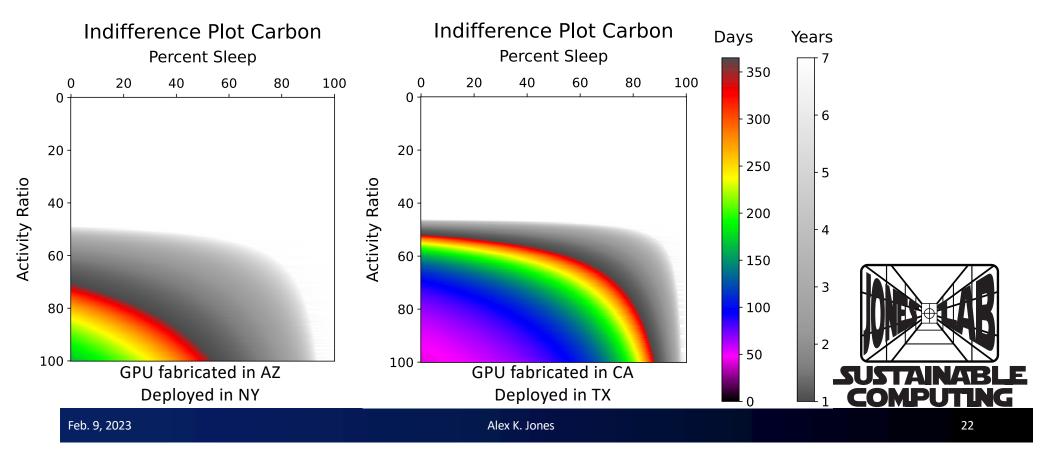
#### Inference Breakeven Comparison



#### Training Indifference Comparison



# Grid Mix Impact





## **Reading List**



- CORUSCANT MICRO, 2022
- POD-RACING IEEE Micro Mag, Nov./Dec 2022
- Sustainable AI Processing at the Edge IEEE Micro Mag, Jan.-Feb. 2023
- Dark Silicon Considered Harmful IGSC 2018
- Considering Fabrication in Sustainable Computing ICCAD 2013
- GreenChip -- SUSCOM, 2019



