

# Mega Trends Driving Architectures of Mobile Computing and IoT Devices

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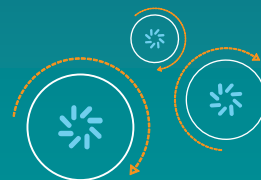
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Vice President, R&D

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## Megatrends in ASICs and Semiconductors

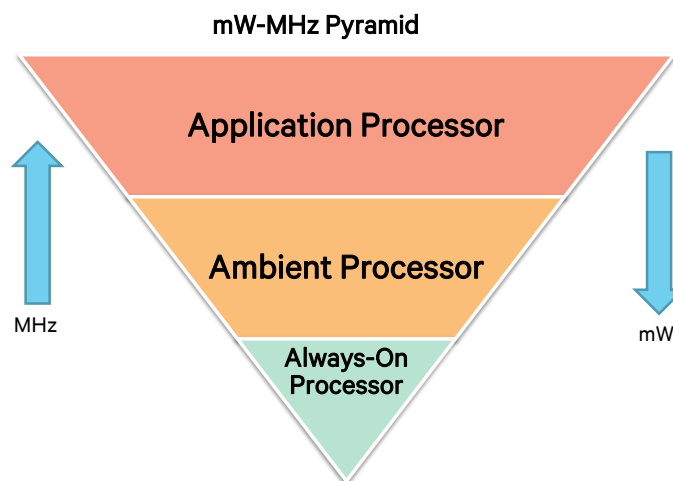
- Moore's Law Stall
- Always On (Always Aware)
- Cloud Computing / Big Data / Security
- Machine Learning / Deep Learning
- Propagation of Technologies Enabled by Mobile Computing
- Emerging Memories



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## Hierarchical Event Driven Computing



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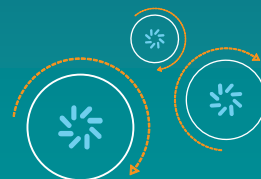
## Cloud Computing



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# Cloud Computing

- New Devices
- New Architectures
- High Performance Computing at Low Cost and Low Power
- Big Data Analytics
- Security



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## Machine Learning / Deep Learning

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## Machine Learning / Brain Inspired Computing

### Human Brain

~ 3.5 petabytes  
~ 20 petaFLOPS  
~ 20 watts

### IBM Sequoia

1.6 petabytes  
16.3 petaFLOPS  
7.9 mega watts

### The Human Brain

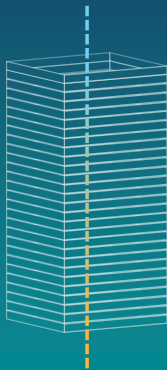
- is a massively parallel machine with ~86B neurons
- has no system clock, it is event driven
- has no hardware/software distinction
- performs processing and memory by the same components
- is a self-organizing, self healing system



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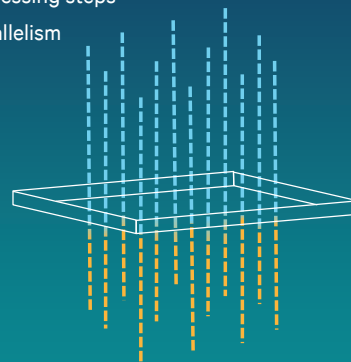
## The Brain is a Massively Parallel Machine

>10<sup>6</sup> processing steps  
<10<sup>1</sup> parallelism



**Modern computer**  
Dense, real-valued data

<10<sup>1</sup> processing steps  
>10<sup>6</sup> parallelism

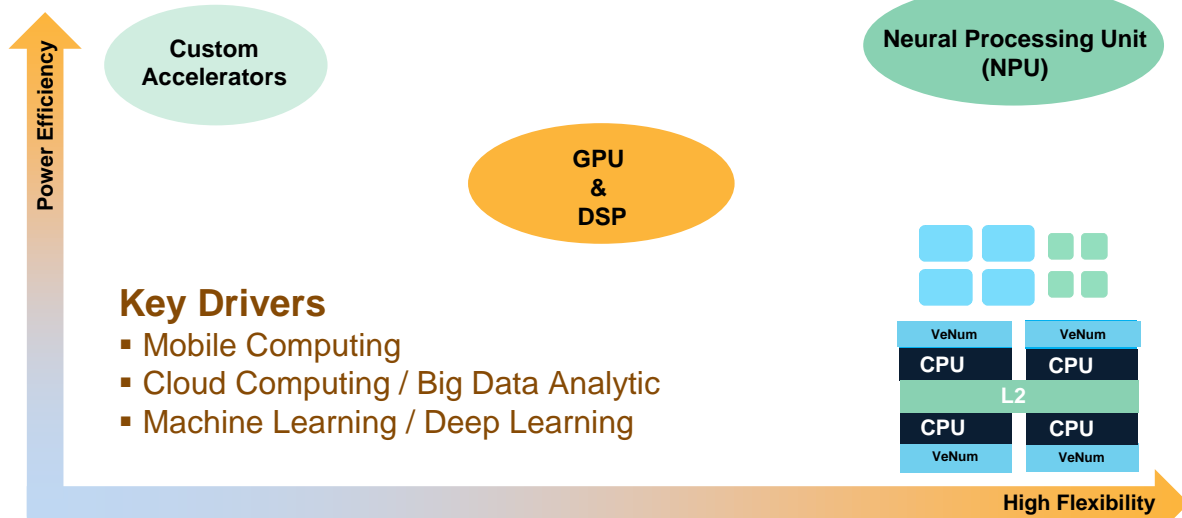


**Human brain**  
Sparse "Events" or "Spikes"



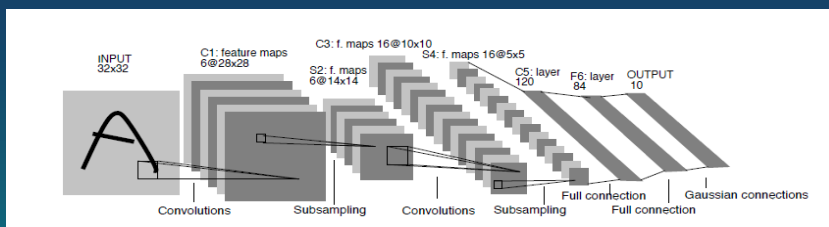
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# Mobile Heterogeneous Compute Units to Lower Power

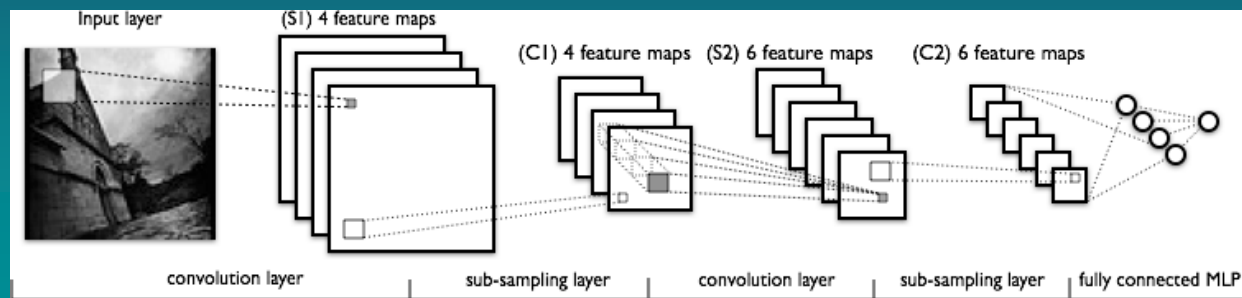


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# Deep Learning



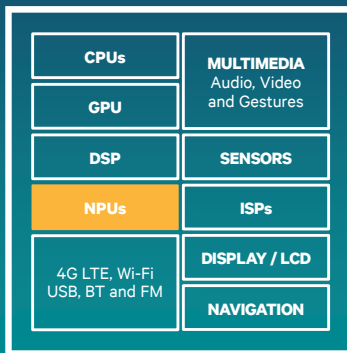
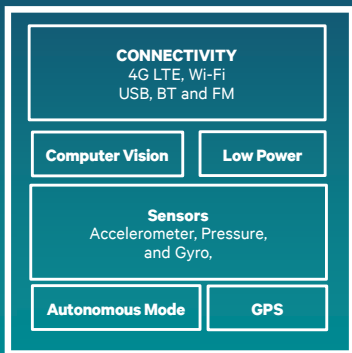
LeCun et al., 1998



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# Neural Processing Units (NPU's)

A new class of processors mimicking human perception and cognition



Massively parallel,  
reprogrammable

Human-like functions

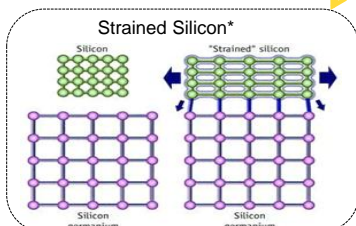
New applications

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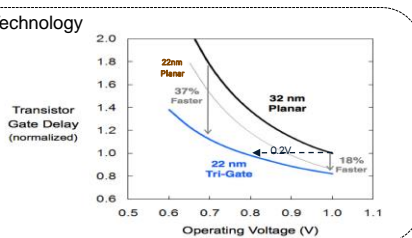
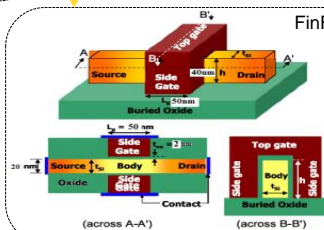
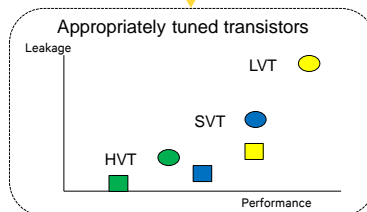
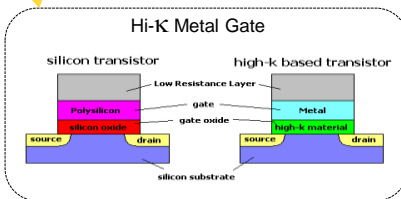
## More Moore (CMOS Scaling)

$$I_{D,Sat} = \mu W C_{inv} v_s (V_G - V_{th})$$

$v_s$  is the saturation velocity for short channel lengths



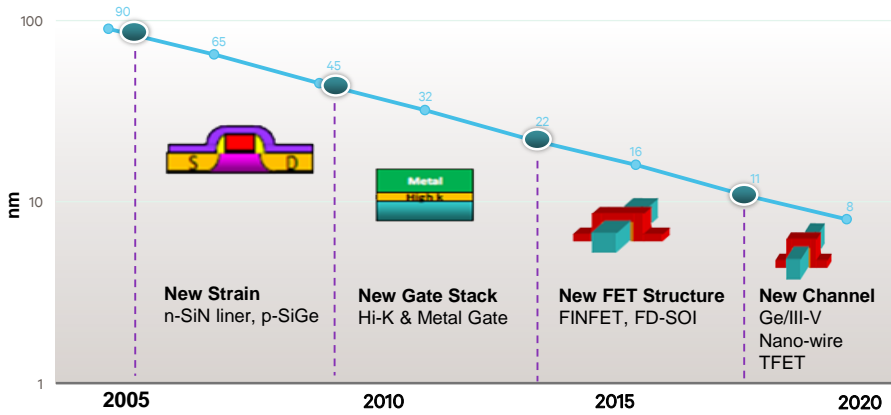
\*or high mobility channel materials



ACKNOWLEDGEMENTS: Perimutter, D. 2012 Sustainability in Silicon and Systems Development. ISSCC Dig. Tech Papers, 30-34.

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## More Moore (CMOS Scaling)



### This Decade: More Moore

- Nano-wire
- TFET
- Ge/III-V

### The 3<sup>rd</sup> Dimension

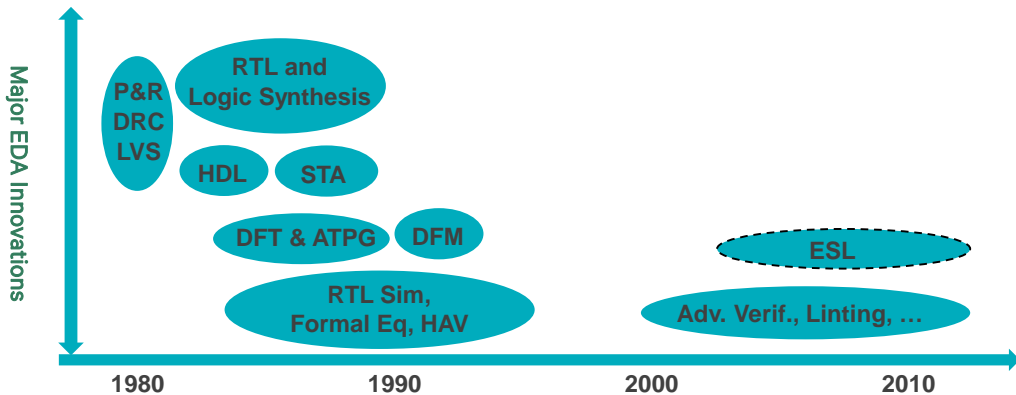
- Resistive memories
- MRAM
- 3DVLSI

SOURCE: ITRS

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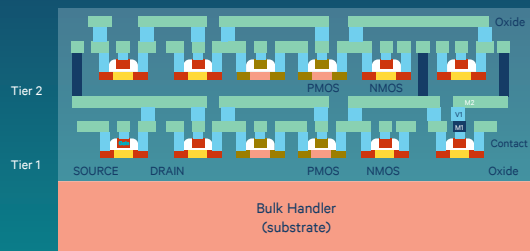
## Rising Silicon Cost

- Cost aspect of Moore Law is not scaling beyond 28nm
  - Expected to improve in 10nm but will continue to be a concern
  - EDA and architectural innovations are required



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## More than Moore (3D-VLSI)

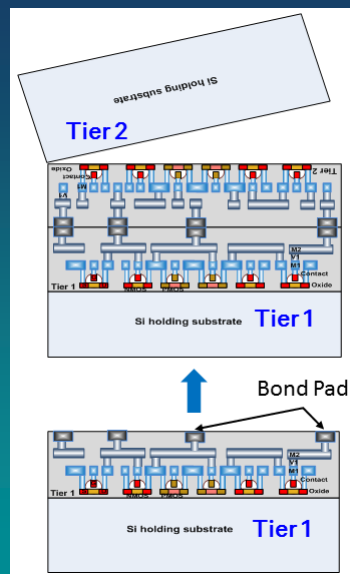


### Key Attributes

- >100,000 inter-tier Vias/mm<sup>2</sup>
- 1 process node advantage

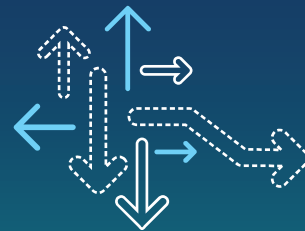
### 3D-VLSI PPA Gains

- 30% power saving
- 40% performance gain
- ~50% footprint reduction



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## Emerging Memories

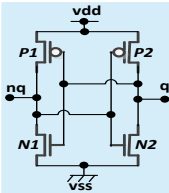
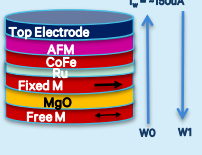
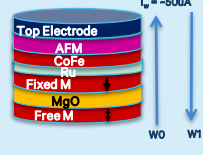


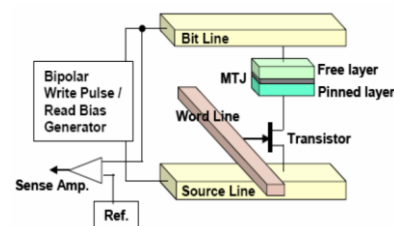


## MRAM

### • MRAM power advantage

- Zero retention/standby power from non-volatility, operating voltage much lower than SRAM
- Reduction in write current also results in higher MRAM density (approaching 5x of SRAM density)

|                           | CMOS SRAM   | In-plane MRAM   | Perpendicular MRAM  |
|---------------------------|---|---|---|
| Memory Element            |  |  |  |
| Magnetic Anisotropy       | N/A   | In-plane  | Perpendicular   |
| Switching Mechanism       | Charge Racing   | Spin-Transfer Torque (STT)  | Spin-Transfer Torque (STT)  |
| Energy per Cell per Write | 0.52 pJ (40nm UMC)  | W0: ~2x SRAM<br>W1: ~1x SRAM  | W0: ~24% SRAM<br>W1: ~12% SRAM  |

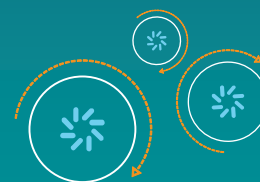


MRAM Bitcell and R/W Circuit

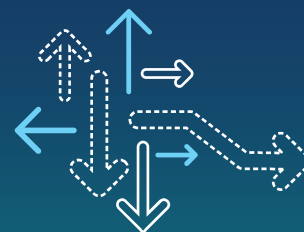
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## Emerging Memories

- MRAM, RRAM, ...
- New memory architectures in mobile computing and data centers
- New computing architecture
- In memory compute



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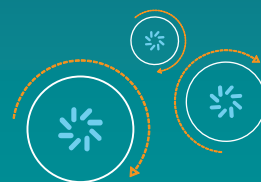
## Propagation of Mobile Computing Wave

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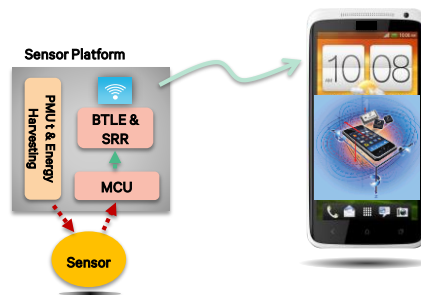
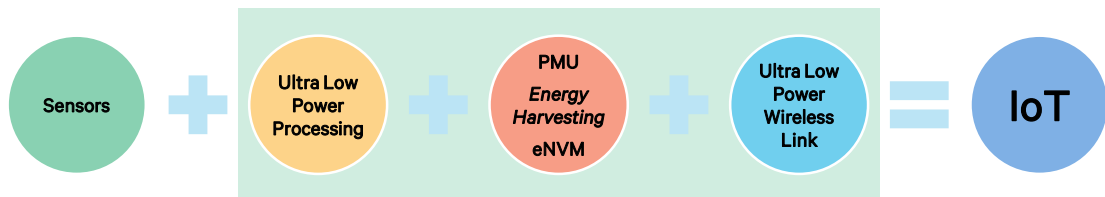
### Propagation of Mobile Computing Wave to Other Markets

- IoT
- Wearables
- Drones and Robotics
- Automotive: Smart Cars
- Health



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## Wearable and IoT Drive New Low Power Design Requirements



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## Conclusion

- Mobile computing enabled a new set of capabilities and applications
  - Heterogeneous computing, low power, low cost sensors
  - Always on, always aware
  - Cloud computing, Wearables, IoT
- Current Mega Trends impacting semiconductors growth and computing architecture
  - Propagation of technologies enabled by Mobile Computing
  - Always on, always aware
  - Cloud Computing /Big Data / Security
  - Machine Learning / Deep Learning
  - Emerging Memories
- New EDA innovations required

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**Thank you!**

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