

# **Panel Session:** ***Amending Moore's Law for Embedded Applications***

**James C. Anderson**  
**MIT Lincoln Laboratory**

**HPEC04**  
**29 September 2004**

**This work is sponsored by the HPEC-SI (high performance embedded computing software initiative) under Air Force Contract F19628-00-C-0002. Opinions, interpretations, conclusions and recommendations are those of the author and are not necessarily endorsed by the United States Government.**

**Reference to any specific commercial product, trade name, trademark or manufacturer does not constitute or imply endorsement.**



# Objective, Questions for the Panel & Schedule

- **Objective:** identify & characterize factors that affect the impact of Moore's Law on embedded applications
- **Questions for the panel**
  - 1). Moore's Law: what's causing the slowdown?
  - 2). What is the contribution of Moore's Law to improvements at the embedded system level?
  - 3). Can we preserve historical improvement rates for embedded applications?

**Panel members & audience may hold diverse, evolving opinions**

- **Schedule**
  - – 1540-1600: panel introduction & overview
  - 1600-1620: guest speaker Dr. Robert Schaller
  - 1620-1650: panelist presentations
  - 1650-1720: open forum
  - 1720-1730: conclusions & the way ahead



# Panel Session: *Amending Moore's Law for Embedded Applications*

**Moderator: Dr. James C. Anderson,  
MIT Lincoln Laboratory**



**Dr. Richard Linderman,  
Air Force Research Laboratory**

**Dr. Mark Richards,  
Georgia Institute of Technology**



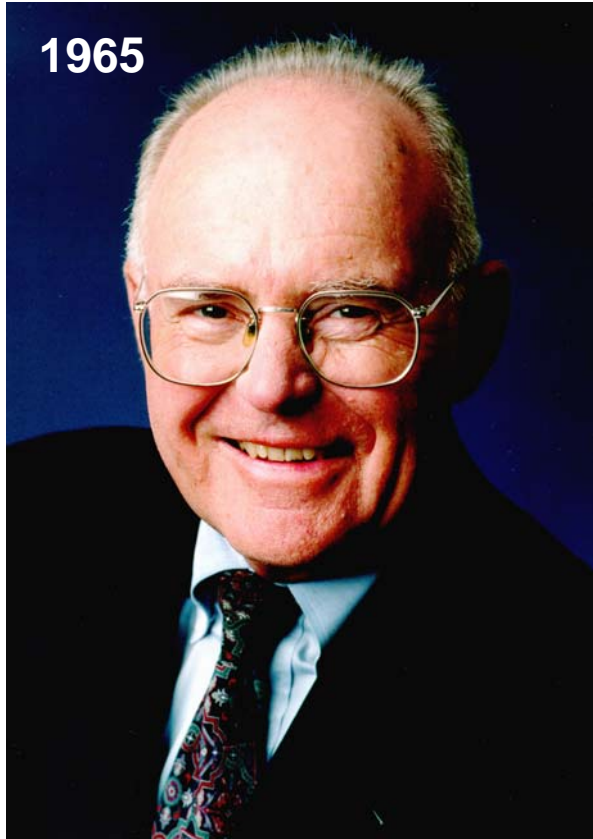
**Mr. David Martinez,  
MIT Lincoln Laboratory**

**Dr. Robert R. Schaller,  
College of Southern Maryland**





# Four Decades of Progress at the System Level



**Gordon Moore publishes  
“Cramming more components  
onto integrated circuits”**

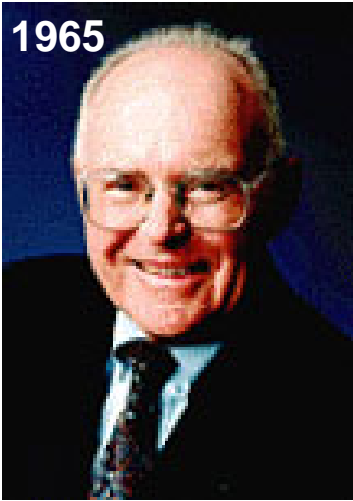


**Computers lose badly at chess**



# Four Decades of Progress at the System Level

1965



Gordon Moore  
publishes  
“Cramming more  
components onto  
integrated  
circuits”

1997



Robert Schaller  
publishes “Moore’s Law:  
past, present and future”



Deep Blue  
(1270kg) beats chess  
champ Kasparov

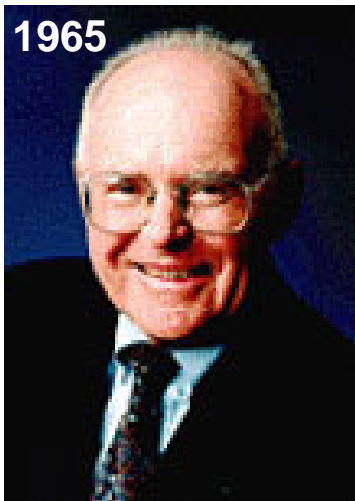


Computers lose  
badly at chess



# Four Decades of Progress at the System Level

1965



Gordon Moore publishes "Cramming more components onto integrated circuits"

1997



Robert Schaller publishes "Moore's Law: past, present and future"

2002-2004



Mark Richards (with Gary Shaw) publishes "Sustaining the exponential growth of embedded digital signal processing capability"



Chess champ Kramnik ties Deep Fritz & Kasparov ties Deep Junior (10K lines C++ running on 15 GIPS server using 3 Gbytes)

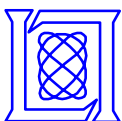


Computers lose badly at chess



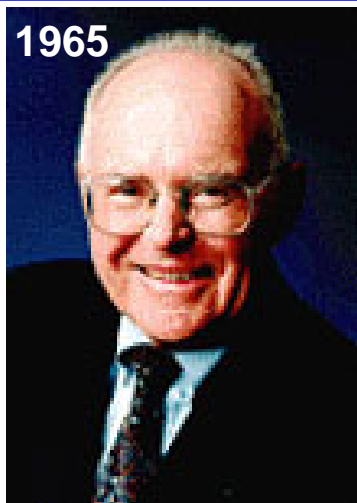
Deep Blue (1270kg) beats chess champ Kasparov





# Four Decades of Progress at the System Level

1965



Gordon Moore publishes  
“Cramming more  
components onto  
integrated  
circuits”



Computers lose  
badly at chess

1997



Robert Schaller  
publishes “Moore’s  
Law: past, present  
and future”



Deep Blue  
(1270kg) beats  
chess champ  
Kasparov

2002-  
2004



Mark Richards (with Gary  
Shaw) publishes  
“Sustaining the  
exponential growth of  
embedded digital signal  
processing capability”



Chess champ Kramnik  
ties Deep Fritz &  
Kasparov ties Deep  
Junior (10K lines C++  
running on 15 GIPS  
server using 3 Gbytes)

~2005

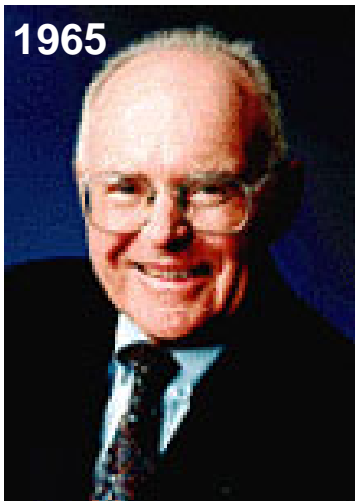


Deep Dew hand-  
held chess champ  
(0.6L & 0.6kg)  
uses 22 AA cells  
(Li/FeS<sub>2</sub>, 22W for  
3.5 hrs) & COTS  
parts incl. voice  
I/O chip



# Four Decades of Progress at the System Level

1965



Gordon Moore publishes  
“Cramming more  
components onto  
integrated  
circuits”

Computers lose  
badly at chess



1997



Robert Schaller  
publishes “Moore’s  
Law: past, present  
and future”

Deep Blue  
(1270kg) beats  
chess champ  
Kasparov



2002-  
2004



Mark Richards (with Gary  
Shaw) publishes  
“Sustaining the  
exponential growth of  
embedded digital signal  
processing capability”



Chess champ Kramnik  
ties Deep Fritz &  
Kasparov ties Deep  
Junior (10K lines C++  
running on 15 GIPS  
server using 3 Gbytes)

~2005



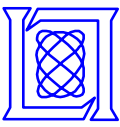
Deep Dew hand-held  
chess champ (0.6L &  
0.6kg) uses 22 AA cells  
(Li/FeS<sub>2</sub>, 22W for 3.5  
hrs) & COTS parts incl.  
voice I/O chip

~2008

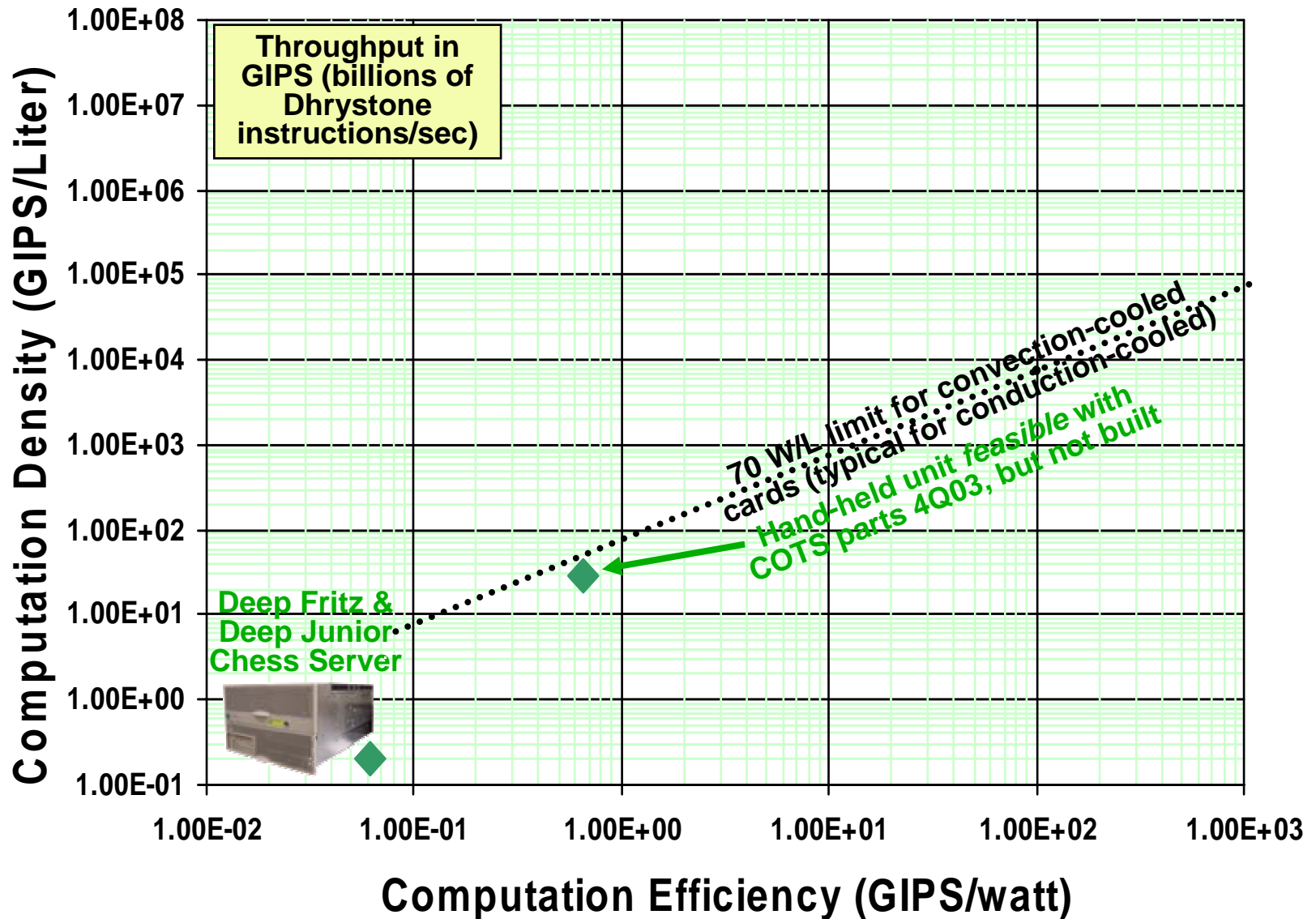


Deep Yogurt has 1/3 the  
size & power of Deep  
Dew, with **3X**  
**improvement in 3 yrs**



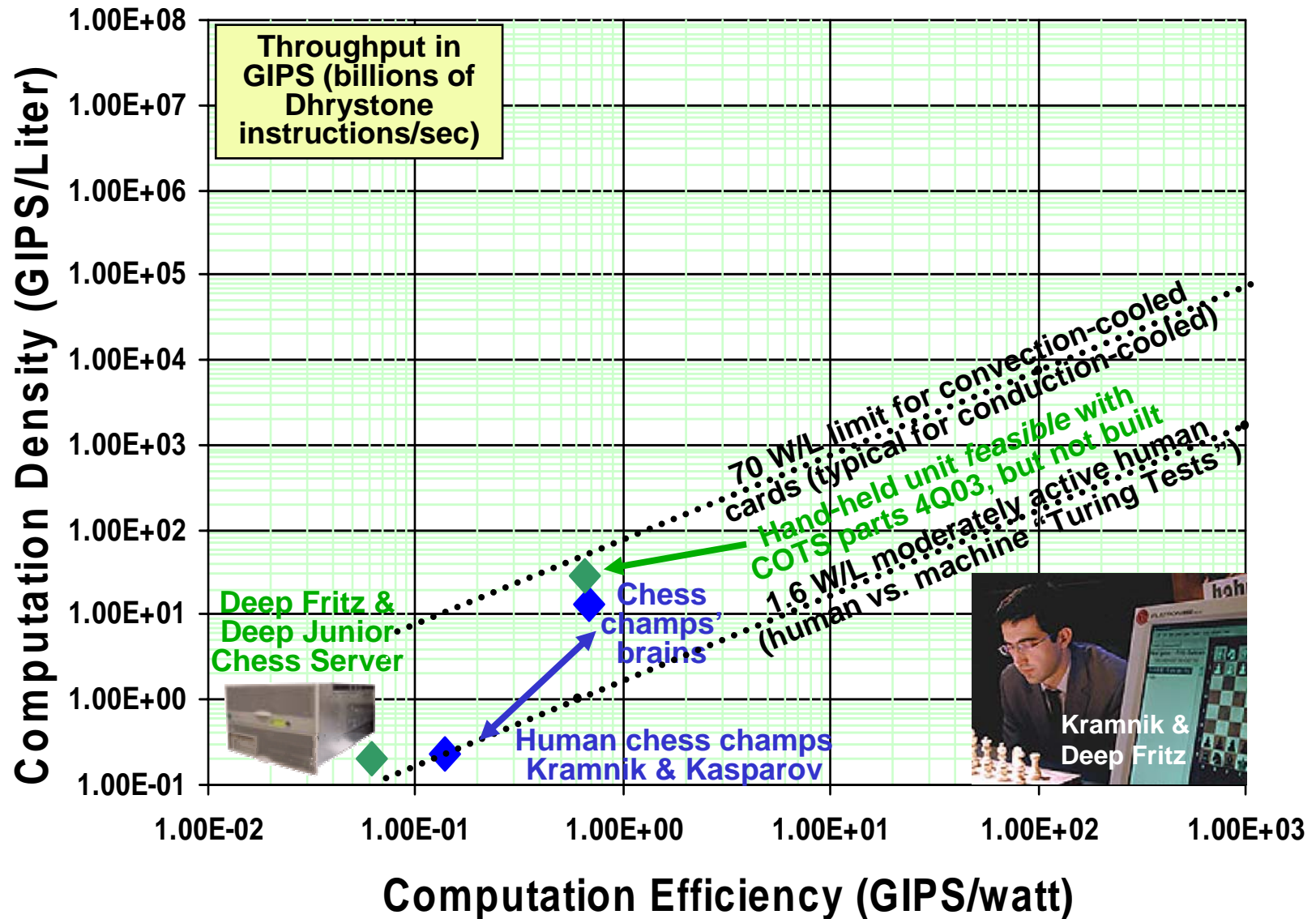


# Power per Unit Volume (Watts/Liter) for Representative Systems ca. 2003



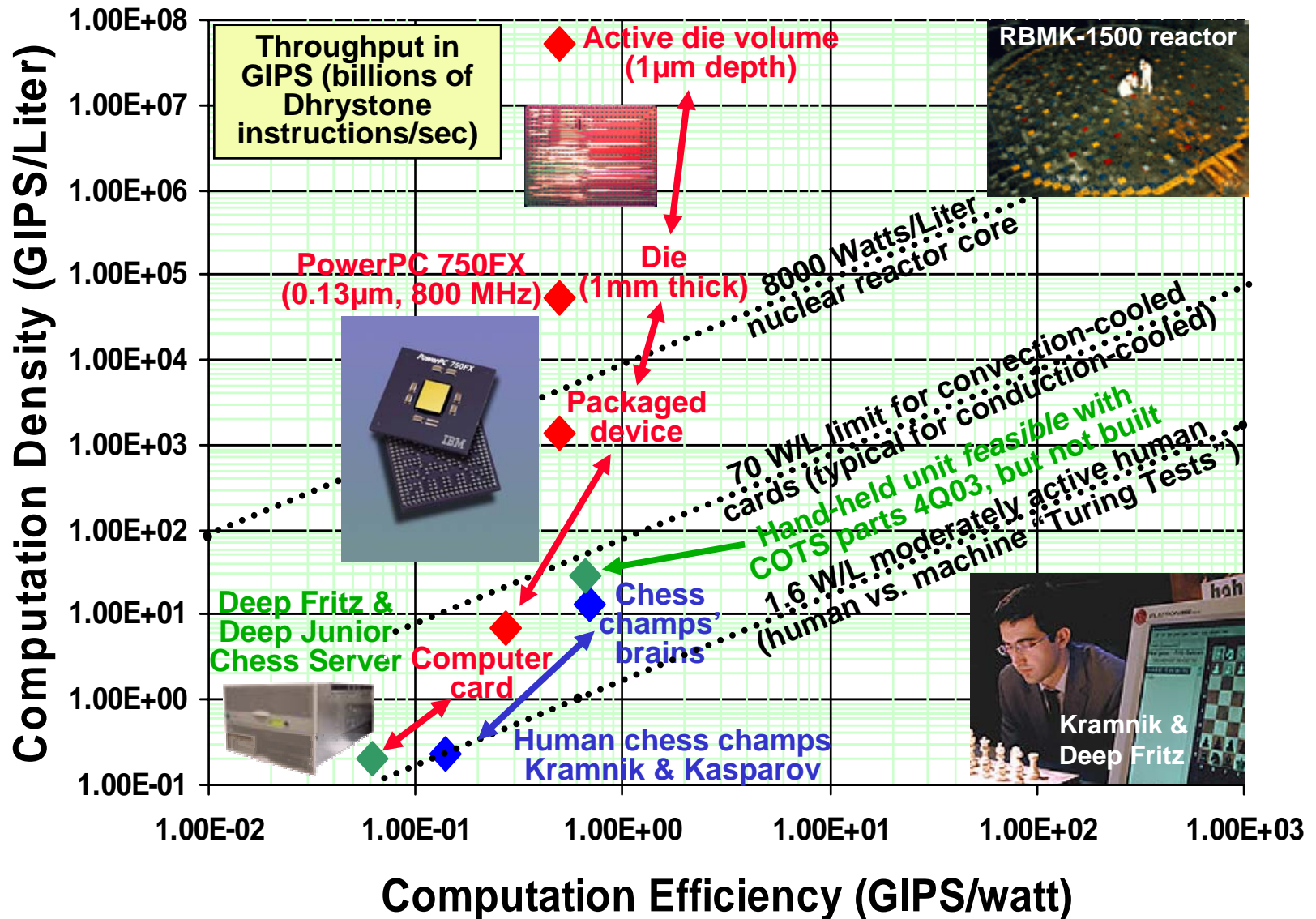


# Power per Unit Volume (Watts/Liter) for Representative Systems ca. 2003



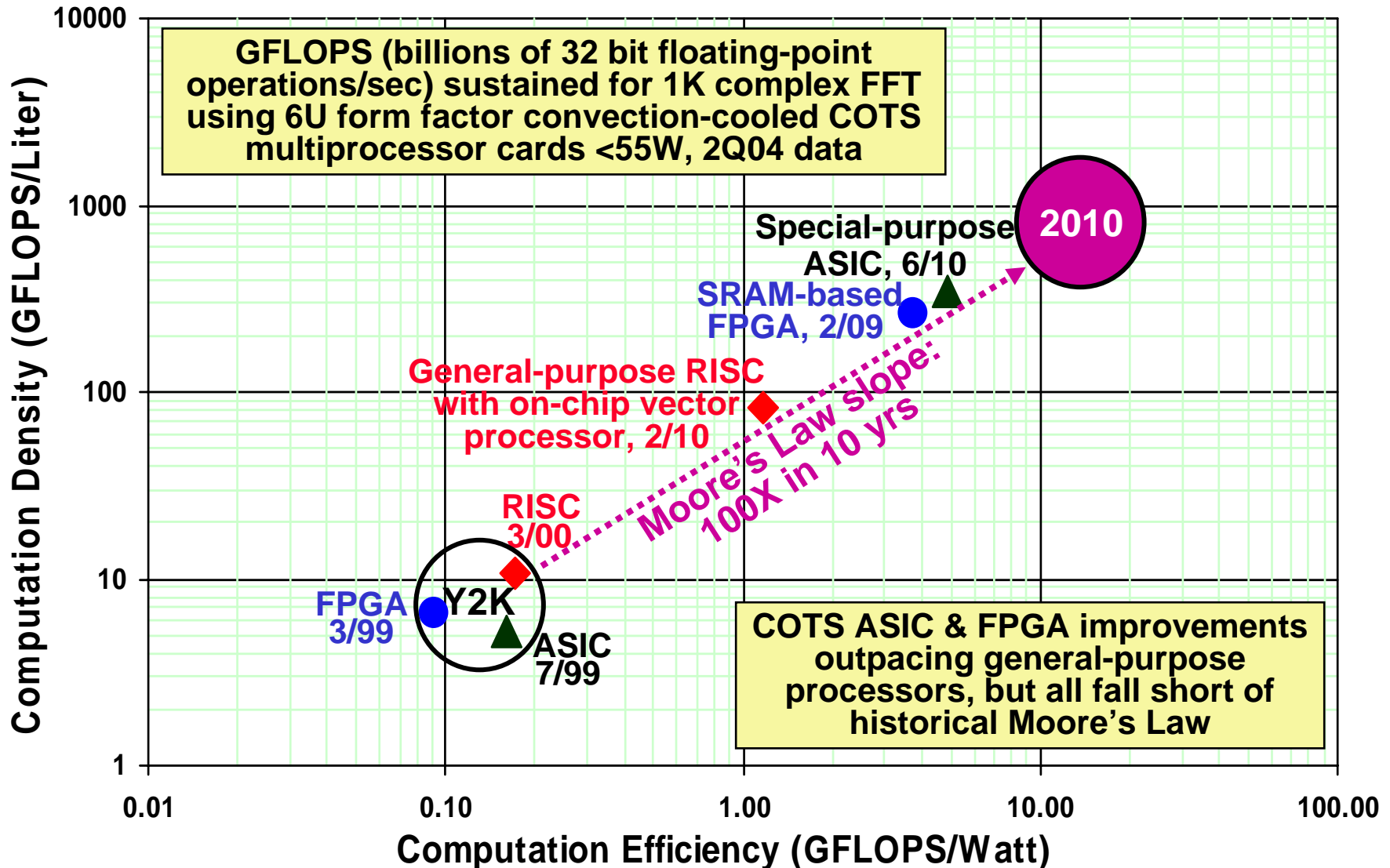


# Power per Unit Volume (Watts/Liter) for Representative Systems ca. 2003



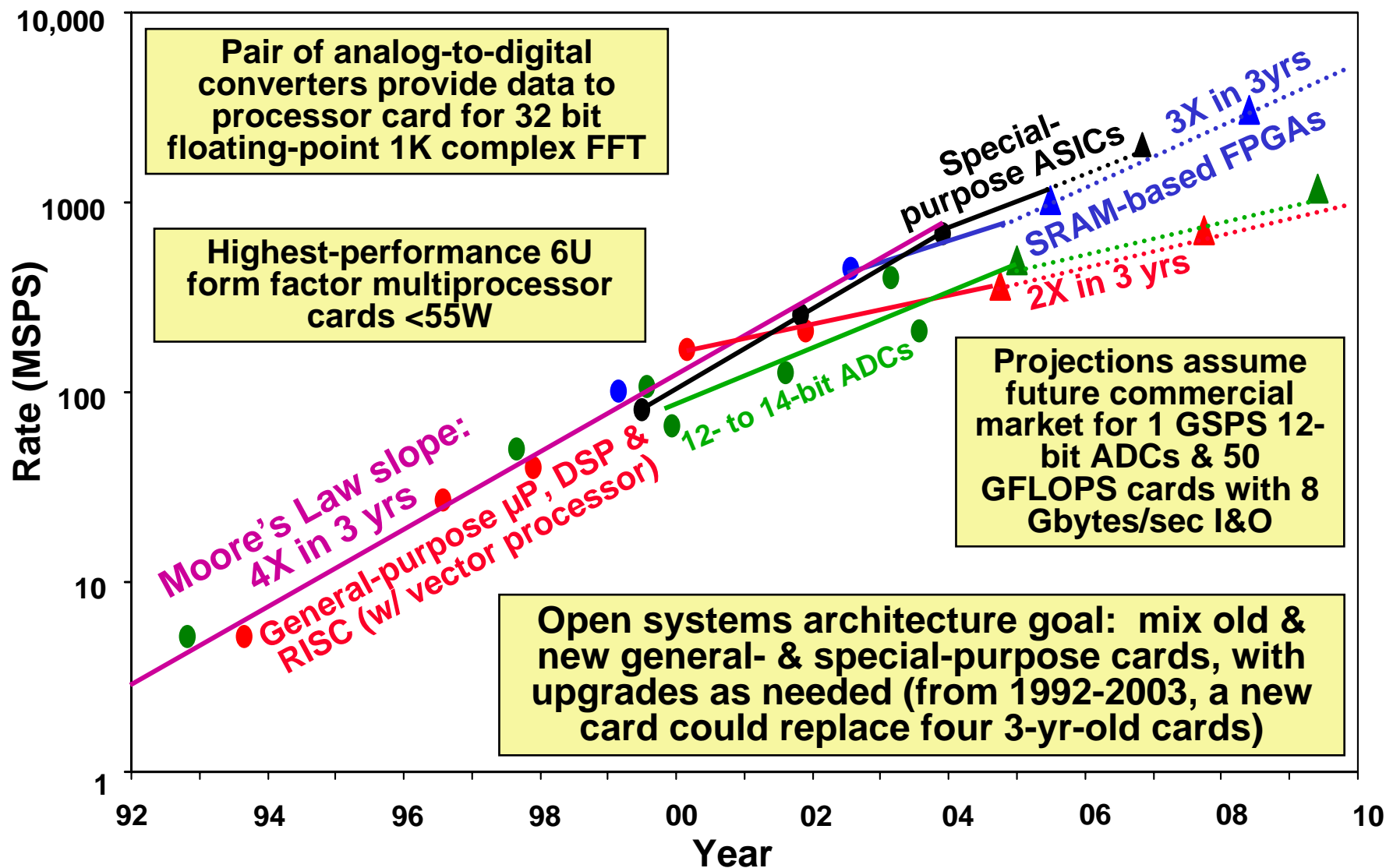


# System-level Improvements Falling Short of Historical Moore's Law





# Timeline for ADC Sampling Rate & COTS Processors (2Q04)



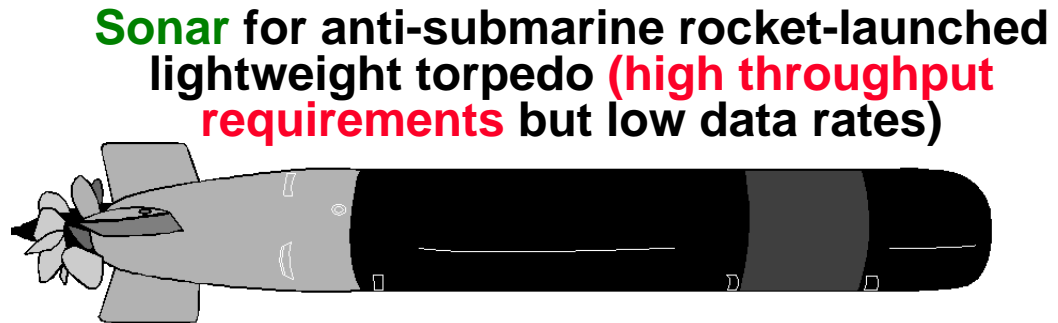




# Representative Embedded Computing Applications



**Radio** for soldier's software-defined comm/nav system (**severe size, weight & power constraints**)



**Sonar** for anti-submarine rocket-launched lightweight torpedo (**high throughput requirements** but low data rates)



~3m wingspan

**Radar** for mini-UAV surveillance applications (**stressing I/O data rates**)

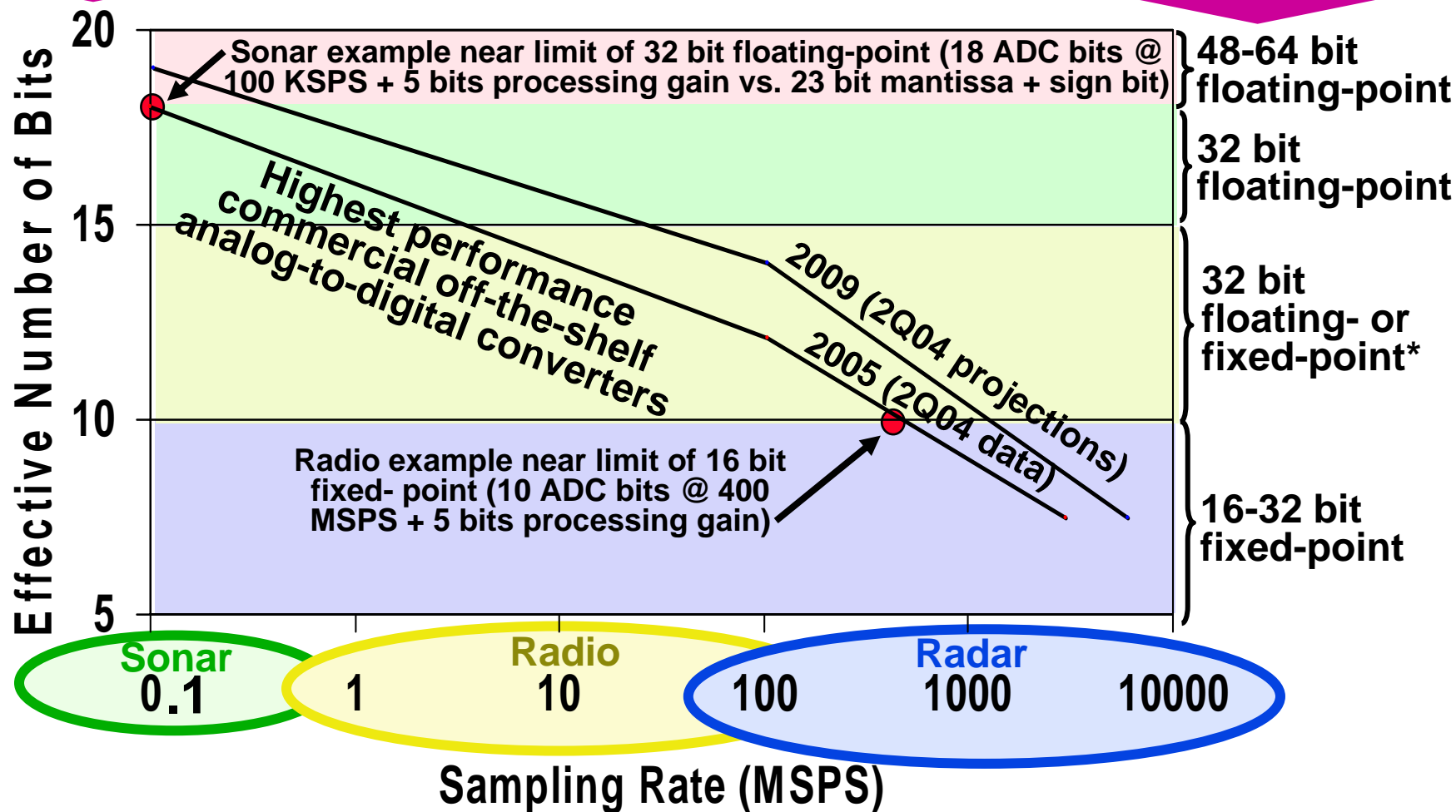
**Cost- & schedule-sensitive real-time applications with high RAS (reliability, availability & serviceability) requirements**



# Embedded Signal Processor Speed & Numeric Representations Must Track ADC Improvements

ADC ENOB

Typical Processor  
Numeric Representation



\*Floating-point preferred (same memory & I/O as fixed-point)



# Objective, Questions for the Panel & Schedule

- **Objective:** identify & characterize factors that affect the impact of Moore's Law on embedded applications
- **Questions for the panel**
  - 1). Moore's Law: what's causing the slowdown?
  - 2). What is the contribution of Moore's Law to improvements at the embedded system level?
  - 3). Can we preserve historical improvement rates for embedded applications?

**Panel members & audience may hold diverse, evolving opinions**

- **Schedule**
  - 1540-1600: panel introduction & overview
  - – 1600-1620: guest speaker Dr. Robert Schaller
  - 1620-1650: panelist presentations
  - 1650-1720: open forum
  - 1720-1730: conclusions & the way ahead



# Objective, Questions for the Panel & Schedule

- **Objective:** identify & characterize factors that affect the impact of Moore's Law on embedded applications
- **Questions for the panel**
  - 1). Moore's Law: what's causing the slowdown?
  - 2). What is the contribution of Moore's Law to improvements at the embedded system level?
  - 3). Can we preserve historical improvement rates for embedded applications?

**Panel members & audience may hold diverse, evolving opinions**

- **Schedule**
  - 1540-1600: panel introduction & overview
  - 1600-1620: guest speaker Dr. Robert Schaller
  - 1620-1650: panelist presentations
  - – 1650-1720: open forum
  - 1720-1730: conclusions & the way ahead



# Conclusions & The Way Ahead

- **Slowdown in Moore's Law due to a variety of factors**
  - Improvement rate was 4X in 3 yrs, now 2-3X in 3 yrs (still substantial)
  - Impact of slowdown greatest in “leading edge” embedded applications
  - Software issues may overshadow Moore's Law slowdown
- **COTS markets may not emerge in time to support historical levels of improvement**
  - Federal government support may be required in certain areas (e.g., ADCs)
  - Possible return of emphasis on advanced packaging and custom devices/technologies for military embedded applications
- **Developers need to overcome issues with I/O standards & provide customers with cost-effective solutions in a timely manner: success may depend more on economic & political rather than technical considerations**
- **Hardware *can* be designed to drive down software cost/schedule, but new methodologies face barriers to acceptance**
- **Improvements clearly come both from Moore's Law & algorithms, but better metrics needed to measure relative contributions**

**“It's absolutely critical for the federal government to fund basic research. Moore's Law will take care of itself. But what happens after that is what I'm worried about.”  
- Gordon Moore, Nov. 2001**





# Backup Slides

---

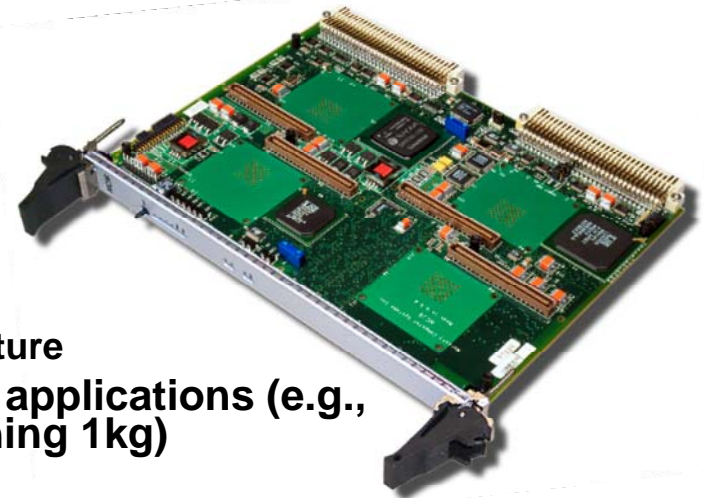


# Points of Reference

- **6U form factor card**

- Historical data available for many systems
- Convection cooled
  - Fans blow air across heat sinks
  - Rugged version uses conduction cooling
- Size: 16x23cm, 2cm slot-to-slot (0.76L)
- Weight: 0.6kg, typ.
- Power: 54W max. (71W/L)
  - Power limitations on connectors & backplane
  - Reliability decreases with increasing temperature
- Can re-package with batteries for hand-held applications (e.g., walkie-talkie similar to 1L water bottle weighing 1kg)

COTS (commercial off-the-shelf) 6U multiprocessor card



- **1024-point complex FFT (fast Fourier transform)**

- Historical data available for many computers (e.g., [fftw.org](http://fftw.org))
- Realistic benchmark that exercises connections between processor, memory and system I/O
- Up to 5 bits processing gain for extracting signals from noise
- Expect 1μsec/FFT (32 bit floating-point) on 6U COTS card ~7/05
  - Assume each FFT computation requires 51,200 real operations
  - 51.2 GFLOPS (billions of floating point operations/sec) throughput
  - 1024 MSPS (million samples/sec, complex) sustained, simultaneous input & output (8 Gbytes/sec I&O)



# Moore's Law & Variations, 1965-1997

- “Original” Moore’s Law (1965, revised 1975)
  - **4X transistors/die every 3 yrs**
  - Held from late '70s - late '90s for DRAM (dynamic random access memory), the most common form of memory used in personal computers
  - Improvements from decreasing geometry, “circuit cleverness,” & increasing die size
  - Rates of speed increase & power consumption decrease not quantified
- “Amended” Moore’s Law: 1997 National Technology Roadmap for Semiconductors (NTRS97)
  - Models provided projections for 1997-2012
  - Improvement rates of 1.4X speed @ constant power & 2.8X density (transistors per unit area) every 3 yrs
  - For constant power, speed x density gave **max 4X performance improvement every 3 yrs**
  - **Incorrectly predicted 560 mm<sup>2</sup> DRAM die size for 2003 (4X actual)**

Historically,  
Performance =  $2^{\text{Years}/1.5}$



# Moore's Law Slowdown, 1999-2003 (recent experience with synchronous DRAM)

- Availability issues: **production did not come until 4 yrs after development** for 1Gbit DDR (double data rate) SDRAMs (7/99 – 7/03)
- SDRAM price crash
  - **73X reduction in 2.7 yrs** (11/99 – 6/02)
  - Justice Dept. price-fixing investigation began in 2002
- Reduced demand
  - Users unable to take advantage of improvements as **\$3 SDRAM chip holds 1M lines of code having \$100M development cost** (6/02)
  - Software issues made Moore's Law seem irrelevant
    - Moore's Law impacted HW, not SW
    - Old SW development methods unable to keep pace with HW improvements
    - SW slowed at a rate faster than HW accelerated
    - Fewer projects had HW on critical path
    - In 2000, 25% of U.S. commercial SW projects (\$67B) canceled outright with no final product**
    - 4 yr NASA SW project canceled (9/02) after 6 yrs (& \$273M) for being 5 yrs behind schedule**

**System-level improvement rates possibly slowed by factors not considered in Moore's Law "roadmap" models**



# The End of Moore's Law, 2004-20XX

- **2003 International Technology Roadmap for Semiconductors (ITRS03)**
  - Models provide projections for 2003-2018
  - 2003 DRAM size listed as 139 mm<sup>2</sup> (1/4 the area predicted by NTRS97)
  - Predicts that future DRAM die will be *smaller* than in 2003
  - Improvement rates of 1.5X speed @ constant power & 2X density every 3 yrs
  - Speed x density gives **max 3X performance improvement every 3 yrs**
  - Limited by lithography improvement rate (partially driven by economics)
- **Future implications (DRAMs & other devices)**
  - Diminished “circuit cleverness” for mature designs (chip & card level)
  - Die sizes have stopped increasing (and in some cases are decreasing)
  - Geometry & power still decreasing, but at a reduced rate
  - Fundamental limits (e.g., speed of light) may be many (more) years away
    - Nearest-neighbor architectures
    - 3D structures
  - Heat dissipation issues becoming more expensive to address
  - More chip reliability & testability issues
  - Influence of foundry costs on architectures may lead to fewer device types in latest technology (e.g., only SDRAMs and static RAM-based FPGAs)

**Slower (*but still substantial*) improvement rate predicted, with greatest impact on systems having highest throughput & memory requirements**





# High-Performance MPU (microprocessor unit) & ASIC (application-specific integrated circuit) Trends

| Year of production                 | 2004    | 2007    | 2010    | 2013    | 2016     |
|------------------------------------|---------|---------|---------|---------|----------|
| MPU/ASIC<br>1/2 pitch, nm          | 90      | 65      | 45      | 32      | 22       |
| Transistors/chip                   | 553M    | 1106M   | 2212M   | 4424M   | 8848M    |
| Max watts @ volts                  | 158@1.2 | 189@1.1 | 218@1.0 | 251@0.9 | 288@0.8V |
| Clock freq, MHz                    | 4,171   | 9,285   | 15,079  | 22,980  | 39,683   |
| Clock freq, MHz,<br>for 158W power | 4,171   | 7,762   | 10,929  | 14,465  | 21,771   |

- **2003 International Technology Roadmap for Semiconductors**
  - <http://public.itrs.net>
  - Executive summary tables 1i&j, 4c&d, 6a&b
  - Constant 310 mm<sup>2</sup> die size
- **Lithography improvement rate (partially driven by economics) allows 2X transistors/chip every 3 yrs**
  - 1.5X speed @ constant power
  - ~3X throughput for multiple independent ASIC (or FPGA) cores while maintaining constant power dissipation
  - ~2X throughput for large-cache MPUs (constant throughput/memory), but power may possibly decrease with careful design



# Bottleneck Issues

- **Bottlenecks occur when interconnection bandwidth (e.g., processor-to-memory, bisection or system-level I/O) is inadequate to support the throughput for a given application**
- **For embedded applications, I/O bottlenecks are a greater concern for general-purpose, highly interconnected back-end vs. special-purpose, channelized front-end processors**

**Can developers provide timely, cost-effective solutions to bottleneck problems?**



# Processor Bottlenecks at Device & System Levels

- **Device level (ITRS03)**

- 2X transistors & 1.5X speed every 3 yrs  
High-performance microprocessor units & ASICs  
Constant power & 310 mm<sup>2</sup> die size
- 3X throughput every 3 yrs *possible* if chip is mostly logic gates changing state frequently (independent ASIC or FPGA cores)
- 2X throughput every 3 yrs is limit for microprocessors with large on-chip cache (chip is mostly SRAM & throughput/memory remains constant)
- Possible technical solutions for microprocessors: 3D structures, on-chip controller for external L3 cache

- **System level**

- 54W budget for hypothetical 6U COTS card computing 32 bit floating-point 1K complex FFT every 1μsec  
10% (5W) DC-to-DC converter loss  
40% (22W) I/O (7 input & 7 output links @ 10 Gbits/sec & 1.5W ea., RF coax, 2004)  
50% (27W) processor (51 GFLOPS sustained) & memory (5 Gbytes)
- Possible technical solutions for I/O  
RF coax point-to-point serial links with central crosspoint switch network (PIN diodes or MEMS switches)  
Fiber optic links (may require optical free-space crosspoint switch) & optical chip-to-chip interconnects



# Examples of Hardware vs. Algorithms

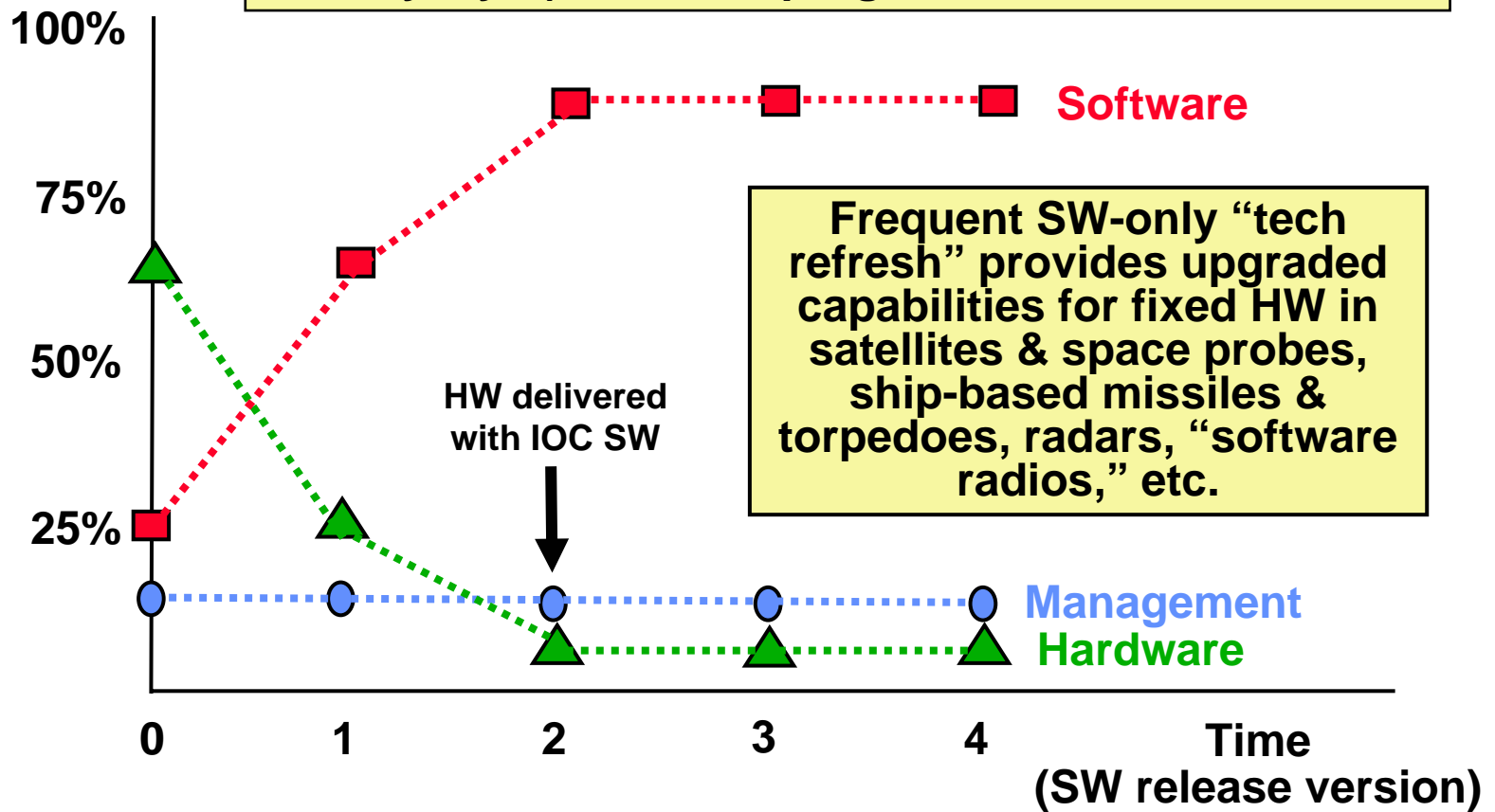
- **Static RAM-based FPGAs**
  - 2002: system-level throughput improved substantially vs. 1999
  - 2/3 of improvement attributable to new devices, 1/3 to architecture changes
- **Chess computers**
  - 1997: Deep Blue provided 40 trillion operations per second using 600nm custom ASICs (but 250nm was state-of-the-art)
  - 2001: Desktop version of Deep Blue using state-of-the-art custom ASICs feasible, but not built
  - 2002-2003: improved algorithms provide functional equivalent of Deep Blue using COTS servers instead of custom ASICs
- **Speedup provided by FFT & other “fast” algorithms**

**Contributions of HW vs. algorithms may be difficult to quantify, even when all necessary data are available**



# Cost vs. Time for Modern HS/SW Development Process (normalized to a constant funding level)

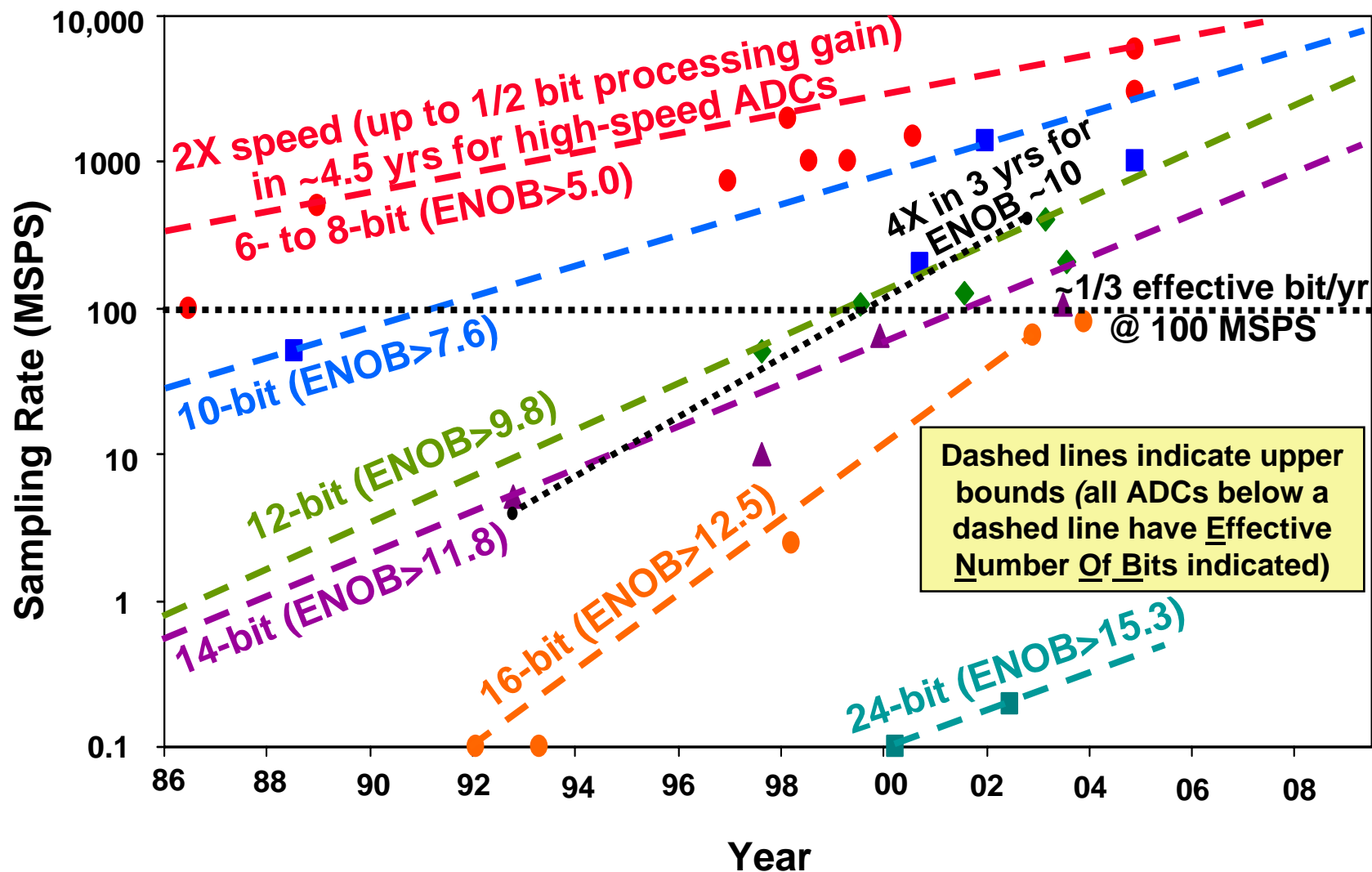
Cost (effort & expenditures)





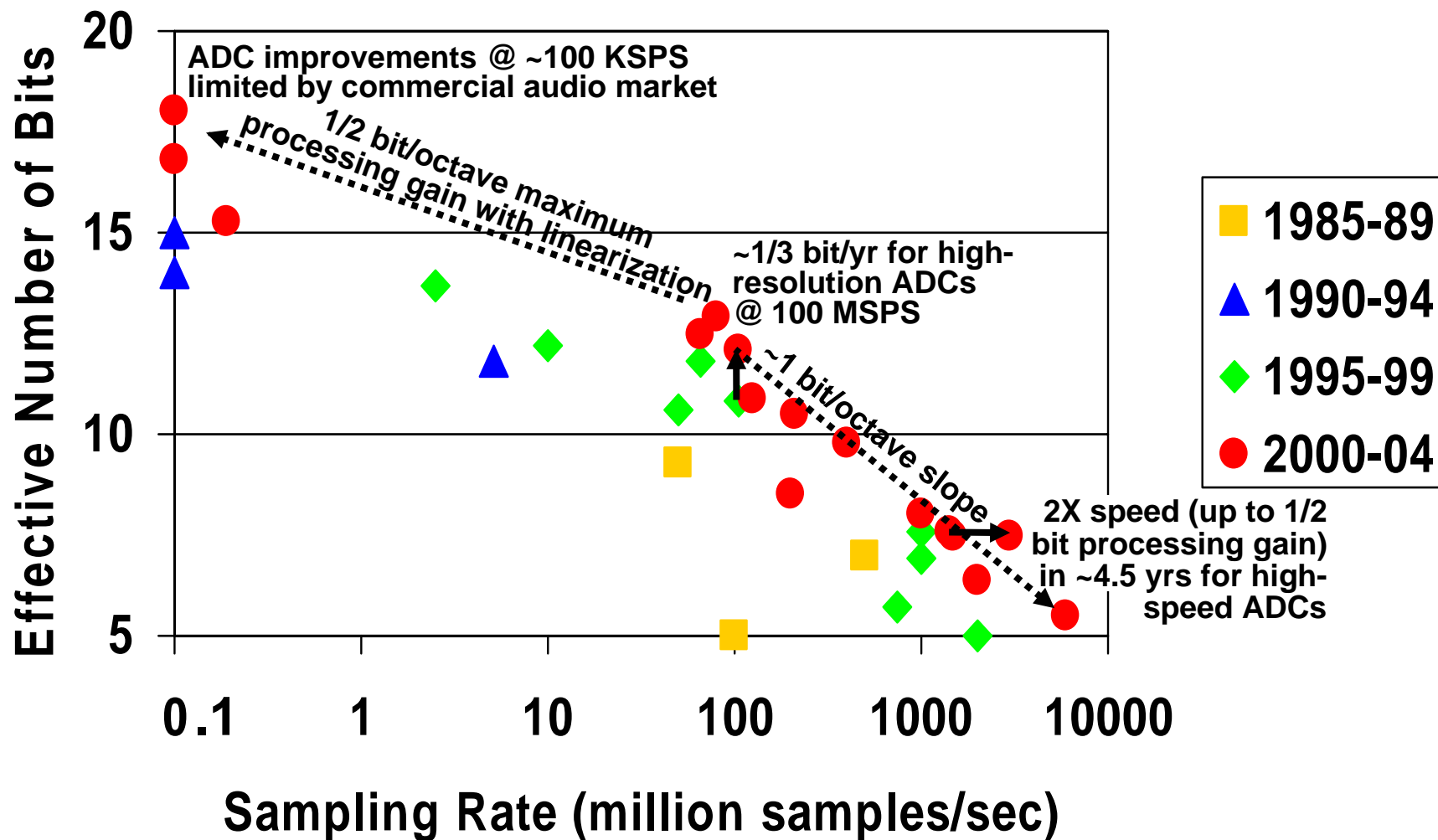


# Timeline for Highest Performance COTS ADCs, 2Q04



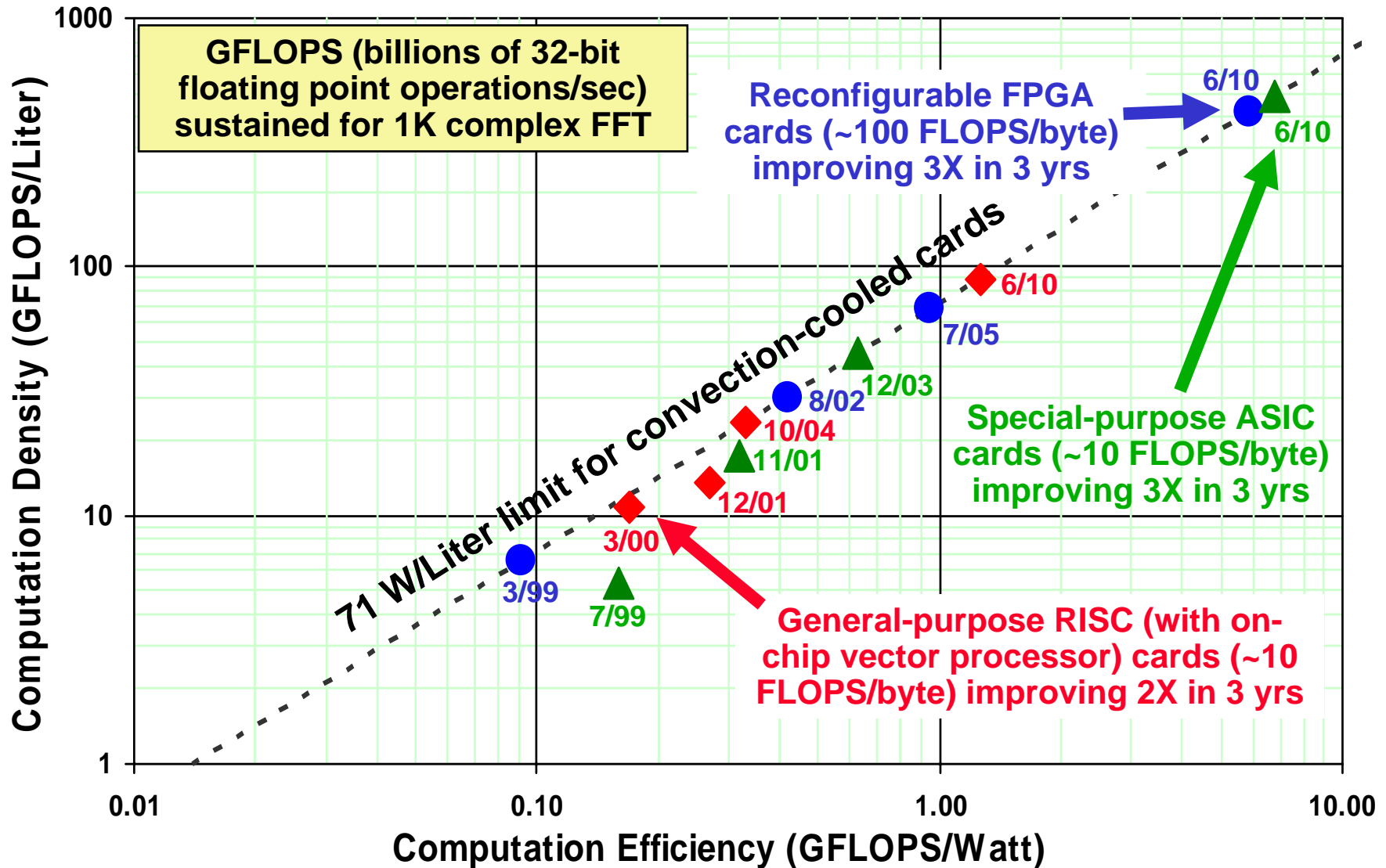


# Improvement Rates for Highest Performance COTS ADCs, 2Q04





# Evolution of COTS Embedded Multiprocessor Cards, 2Q04





# Timeline for Highest Performance COTS Multiprocessors, 2Q04

