




Data-Oriented Design


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An Aperture Science Computer Efficiency
Enrichment Strategy



Data Oriented Design is...

- A software design methodology
- Separates data from the requisite logic
- Brings the data to the forefront
- Offers performance benefits over raw OOP
- Can be used alongside OOP and other patterns
- First popularized in the video game industry




A shift of focus

- Focus on how data is

- Represented
- Moved
- Shared
- Transformed

- Not on

- What objects do
- How objects interact




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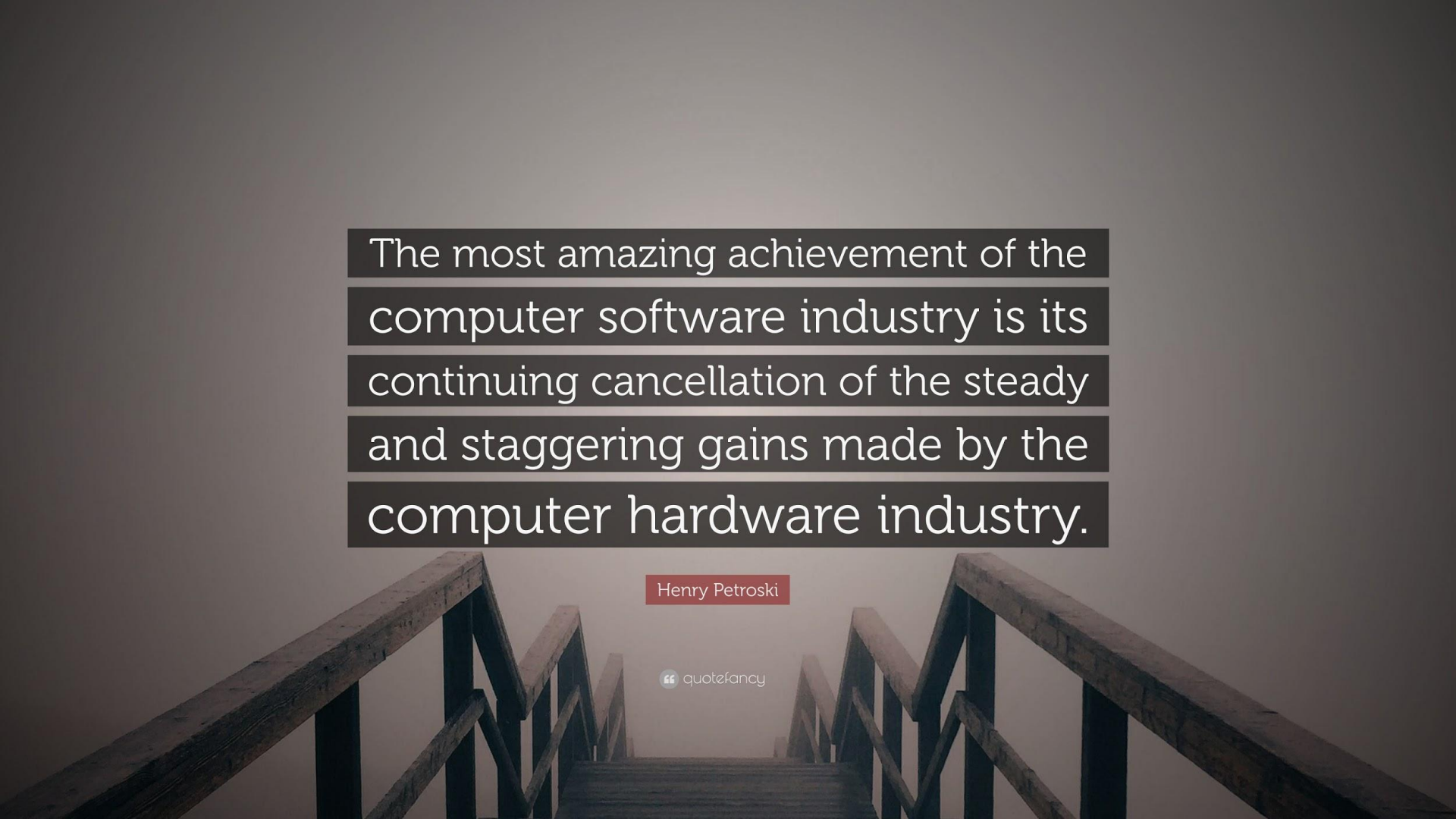
- Represented
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- What objects do
- How objects interact

Why do this?





The most amazing achievement of the
computer software industry is its
continuing cancellation of the steady
and staggering gains made by the
computer hardware industry.

Henry Petroski

“ quote fancy

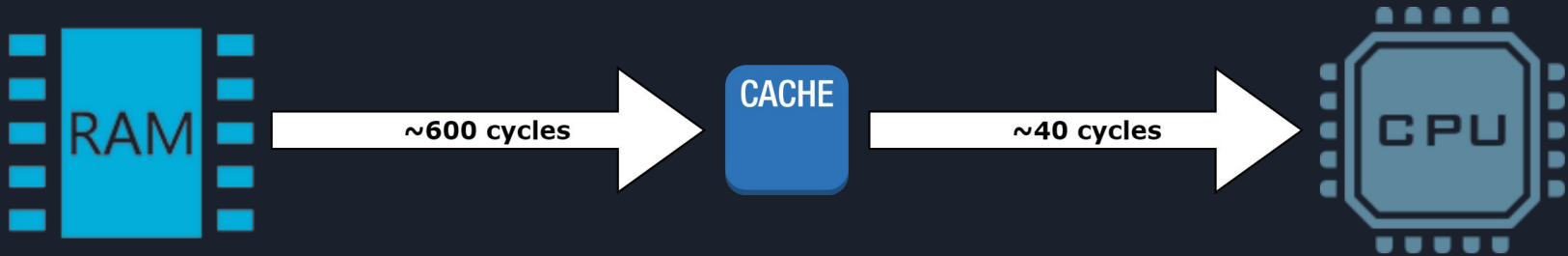
Why do this?

- It's all about real world performance
- Improved utilization of CPU cache
- **Parallelization** becomes much easier
- Code is generally more **modular**
- Modular code is easier to **test**!



Why do this?

- Organize data in a CPU friendly way
 - Memory is slow, lookups are expensive
 - CPU cache is fast, lookups are cheap
- CPU friendly is also developer friendly
- Cut down on “cache misses”

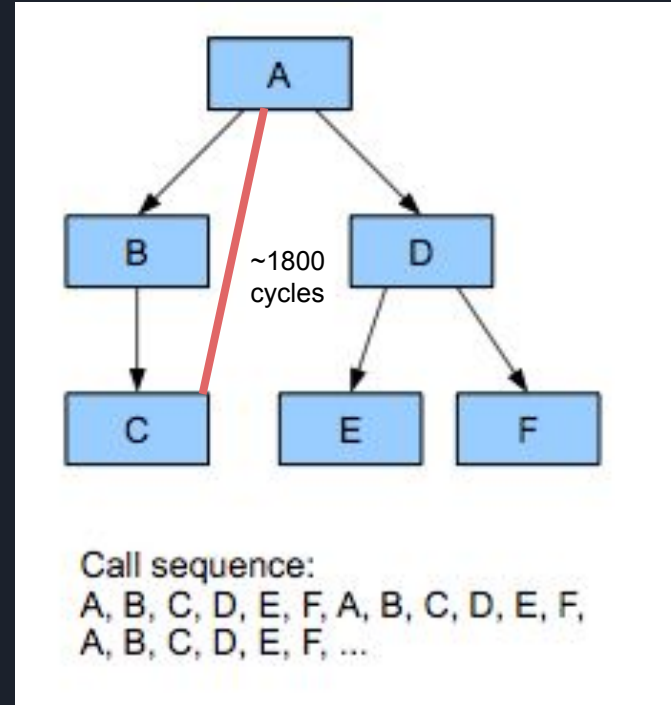


Data Layouts

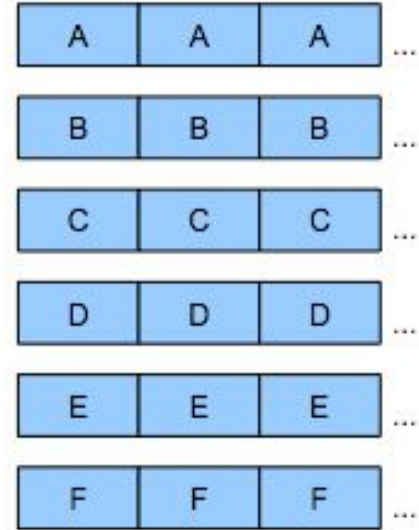


The drawback of OOP

- Data naturally laid out in a tree
- Becomes deeply nested
- Many kinds of data together
- Complex lookups
- Most ideal for human brains
- Hard to parallelize, non-sequential



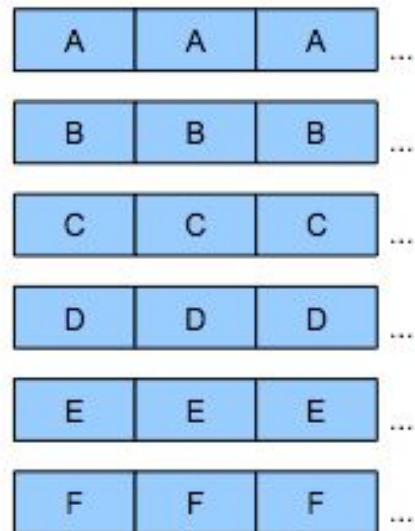
- Code is much less important
- Data is most important
 - Types of data
 - How data is read
 - How data is processed
- Design for the access pattern



Call sequence:

A, A, A, ..., B, B, B, ..., C, C, C, ...,
D, D, D, ..., E, E, E, ..., F, F, F, ...

- Data laid out in linear arrays
- Similar data packed together
- Lookups are trivial
- Ideal for robot brains
- Easy to parallelize, sequential

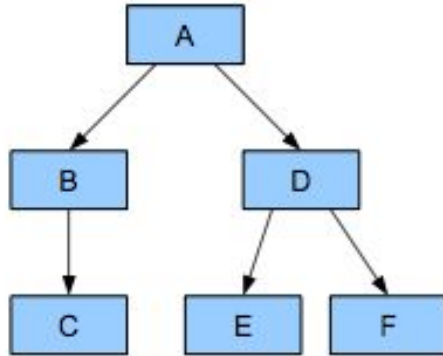


Call sequence:

A, A, A, ..., B, B, B, ..., C, C, C, ...,
D, D, D, ..., E, E, E, ..., F, F, F, ...

Design for the access pattern

deep and complex

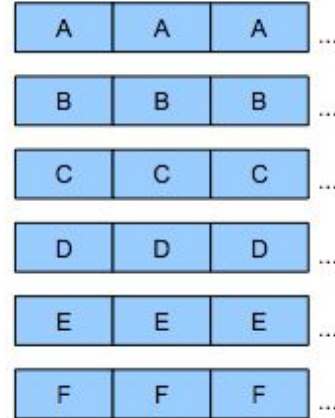


Call sequence:

A, B, C, D, E, F, A, B, C, D, E, F,
A, B, C, D, E, F, ...

Incidental processing of
diverse data

flat and contiguous

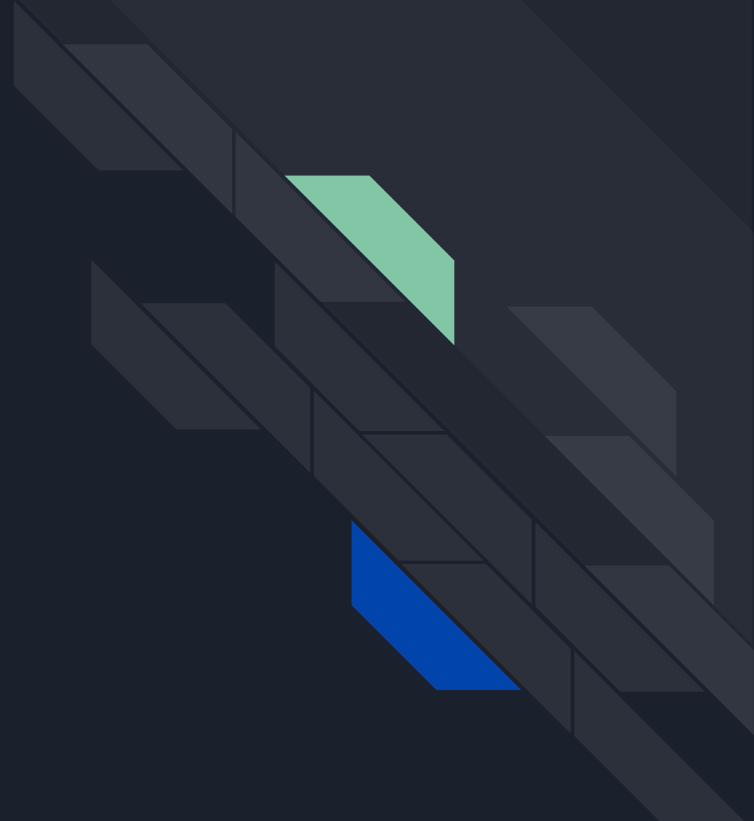


Call sequence:

A, A, A, ..., B, B, B, ..., C, C, C, ...,
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Repetitious transformation
of many items

Won't this make code
harder to understand
and write?





YNEOS!



A different mindset

- Requires you to think differently than OOP
- You have to train your brain
- Old habits die hard
- Flexible and modular code
- Threadability!

Modularity




Separation of logic and state

- Think of code as **transformations of data**
- Naturally more functional patterns emerge
- Data agnostic functions are more reusable
- Code that acts on one data set easily acts on many
- Code Lego!



Parallelization






Tracking data

- Keeping track of data accessors is tough
- Resource locking is counter productive
- Sync points negate the effect of threads
- Chaining cuts down on sync points
- Need to map out dependencies and control workflow

- DOD helps find dependency chains
- Keep units of data on one thread
- Take advantage of **order independent execution**
- Isolate independent code paths, execute separately
- When you know the flow of data it becomes easier to verify that your threads are correct and safe



Sauces

- DICE
[http://www.dice.se/wp-content/uploads/2014/12/Introduction to Data-Oriented Design.pdf](http://www.dice.se/wp-content/uploads/2014/12/Introduction%20to%20Data-Oriented%20Design.pdf)
- Noel Llopis
<http://gamesfromwithin.com/data-oriented-design>
- Noel Llopis
<http://gamesfromwithin.com/data-oriented-design-now-and-in-the-future>
- Niklas Frykholm
<http://gamedevs.org/uploads/practical-examples-in-data-oriented-design.pdf>
- Mike Acton
<https://www.youtube.com/watch?v=rX0ItVEVjHc>
- Marinara
<https://www.bonappetit.com/recipe/classic-marinara-sauce>
- Extra materials
<https://github.com/dbartolini/data-oriented-design>

<https://media.giphy.com/media/K3StLJ7MtN1Li/giphy.gif>

