

Language: Fragmentation of Machine Architecture

Sean Parent | Sr. Principal Scientist Adobe Software Technology Lab Mario Wolczko | Oracle Labs

Artwork by **UV Zhu** / China



Desktop Applications – Recent History

- Macintosh
 - 68K, single-core
 - PPC, single-core
 - Intel, multi-core, SIMD, OpenGL/CL
- Windows •
 - Intel, single-core •
 - Intel, multi-core, SIMD, OpenGL/CL •



Two Key Events

- 2005 we hit the physical limits of Moore's Law under current technology
- 2007 the iPhone is introduced

2009 Projected Processor Characteristics



The future of computing beyond Moore's Law, Volume: 378, Issue: 2166, DOI: (10.1098/rsta.2019.0061)

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How are we doing?



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Desktop Compute Power (8-core 3.5GHz Sandy Bridge + AMD Radeon 6950)





Platform Expansion

- Mobile
 - iPhone fundamentally changed mobile devices
- Web •
 - Content Ubiquity is expected
- Tablets •
 - Larger "phones" succeeded where smaller desktops failed

Platform Expansion

- In 2012 I gave an internal presentation at Adobe on content ubiquity
 - Broadband was available to th majority of the popultion in the developed countries •
 - Soon will be true worldwide
 - Noted capabilities of mobile devices
 - Increased by > 8x
 - •

Because content ubiquity is becoming a base expectation, not providing it will kill a product

Platform Expansion





Platform Fragmentation

- · macOS
- Win32 & UXP
- $\cdot\,$ iOS and iPadOS
- Android
- Linux (server)
- W3C

Instruction Set Fragmentation

- Intel (AVX SIMD)
- ARM (Neon SIMD)
- WASM (WASM SIMD)
 - Currently 32 bit address space

GPU Platform Fragmentation

- Metal (Apple)
- DX12 (Microsoft)
- Vulcan (Open Standard, Android, Linux)
- · CUDA (NVIDIA)
- WebGPU (Browsers)

Amdahl's Law



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Hardware to Fight Amdahl's Law

- \cdot NUMA
- DMA to discrete GPU •
- Unified Memory (Apple's M1 chips)
- Optane?

• "The unified memory requires a very different approach to that on Windows with discrete GPUs."



Hardware to Manage Power

- Thermal Throttling
- Heterogeneous Cores
- Discrete / Integrated GPU Switching

Languages Are Not Keeping Up

- We are struggling to find models to reason about concurrent systems
 - CSP, Actors, Functional, ...
- Safer languages have higher overhead •
 - But unsafe languages are harder to get correct •

• My estimate is we are leaving 2^3 to 2^5 times performance on the table

Operation Costs are Not Reflected In Code

Not all CPU operations are created equal



thare.com	Operation Cost in CPU Cycles	10 °	10 ¹	10 ²	10 ³	10 ⁴	10 ⁵	10 ⁶
"Simple" register-register op (ADD,OR,etc.)		<1						
	Memory write	~1						
	Bypass delay: switch between							
	integer and floating-point units	0-3						
	"Right" branch of "if"	1-2						
	Floating-point/vector addition	1-3						
	Multiplication (integer/float/vector)	1-7						
	Return error and check	1-7						
	L1 read		3-4					
	TLB miss		7-21					
	L2 read		10-12					
"Wrong" branch of "if" (branch misprediction)			10-20					
	Floating-point division		10-40					
	128-bit vector division		10-70					
	Atomics/CAS		15-30					
	C function direct call		15-30					
	Integer division		15-40					
	C function indirect call		20-50					
	C++ virtual function call		30	-60				
	L3 read		30	-70				
	Main RAM read			100-150				
NU	IMA: different-socket atomics/CAS			100 200				
	(guesstimate)			100-300				
	NUMA: different-socket L3 read			100-300				
Allocatio	n+deallocation pair (small objects)			200-50	DO			
NUM	A: different-socket main RAM read			300	-500			
	Kernel call				1000-1500			
Т	hread context switch (direct costs)				2000			
	C++ Exception thrown+caught				5000-1	0000		
	Thread context switch (total costs,					10000 - 1	million	
	including cache invalidation)							
		111	111	111	111	111	111	111







What is wrong with C++

- C++ allow us to control memory layout and sharing
- Compiler is blind to sharing *aliasing* + *mutation* kills optimization
 - Developer is also blind to sharing making code difficult to reason about •
- Lack of safety makes it very difficult especially in the presence of concurrency for new developers
- Basic library primitives for concurrency (threads) are very expensive
- Performance penalty (Stepanov Abstraction Penalty) to wrap basic arithmetic types
 - i.e. treat a uint8_t as a value from 0.0 1.0
 - Code the same algorithm with different function names or pay the tax





- Despite the limitations and drawbacks, C++ is still performance king*
- Adobe has a massive investment in C++ code bases
- Can C++ be improved enough?
 - The pace of C++ advancement is still rapid
- If another language proved to be better, what does the migration look like?

Possible Future?

- In 2007 I gave a Google TechTalk, A Possible Future of Software Development
 - Observation Most developers cannot write a correct binary search (still true) •
 - An argument for developing generic libraries and concepts
 - Conjecture All problems of scale become a network problem
 - An argument for developing declarative systems
 - BNF, SQL, HTML, Spreadsheets
 - In imperative languages a single relationship becomes multiple functions •

Imperative Solution to Mini-Image Size

```
#import "ImageSizeController.h"
#import <Foundation/NSObject.h>
#import <AppKit/NSNibDeclarations.h>
#import <AppKit/NSControl.h>
#import <AppKit/NSCell.h>
#import <Foundation/NSNumberFormatter.h>
#import <Foundation/NSNotification.h>
#import <AppKit/NSTextField.h>
#import <math.h>
#import <stddef.h>
```

/* Reading a text field with a formatter attached forces the text through the formatter. *,

```
static double TextField unformattedDoubleValue(
             id textField ) {
  id formatter = [ textField formatter ];
  [ textField setFormatter: nil ];
  double result = [ textField doubleValue ];
  [ textField setFormatter: formatter ];
   return result;
```

* Same logic but for integers. */

```
static double TextField_unformattedIntValue(
              id textField ) {
  id formatter = [ textField formatter ];
   [ textField setFormatter: nil ];
   int result = [ textField intValue ];
  [ textField setFormatter: formatter ];
   return result;
```

* Setting a text field while it is editing doesn't manage to set the text. So, we have to stop editing and the estart. */

```
static void TextField setDoubleValueAndFormatter(
               id textField,
              double value,
              NSFormatter *formatter ) {
```

BOOL wasEditing = [textField abortEditing];

/* If we're changing the formatter, then we want to make sure that the display updates including the edit field. */

if([textField formatter] != formatter) { [textField setFormatter: formatter]; [textField setDoubleValue: value - 1.0];

[textField setDoubleValue: value];

if(wasEditing) { [textField selectText: nil];

/* Same logic but with integer values. */

```
static void TextField setIntValueAndFormatter(
               id textField,
                int value,
```

NSFormatter *formatter) { BOOL wasEditing = [textField abortEditing];

/* If we're changing the formatter, then we want to make sure that the display updates including the edit field. *

if([textField formatter] != formatter) { [textField setFormatter: formatter]; textField setIntValue: value - 1];

[textField setIntValue: value];

if(wasEditing) { [textField selectText: nil];

/* Here is the class declaration for the controller. *

@interface ImageSizeController : NSObject { IBOutlet id heightField_; IBOutlet id widthField_; IBOutlet id constrainProportionsBox_; IBOutlet id usePercentagesBox_; IBOutlet NSNumberFormatter *pixelFormatter ;

IBOutlet NSNumberFormatter *percentFormatter_; @private

- int initialWidthPixels ; int initialHeightPixels_; int widthPixels_;
- int heightPixels ; double widthPercentage
- double heightPercentage_
- BOOL constrainProportions_ BOOL usePercentages ;
- (void) showWidth;
- (void) showHeight;
- (void) showAll; (IBAction) heightAction: (id)sender;
- (IBAction) widthAction: (id)sender; (IBAction) constrainProportionsAction: (id)sender;
- (IBAction) usePercentagesAction: (id)sender;
- (IBAction) apply: (id)sender;
- (IBAction) revert: (id)sender;
- (void) awakeFromNib;

@implementation ImageSizeController

```
/* Update the width field. */
(void) showWidth (
  if( usePercentages ) {
```

TextField_setDoubleValueAndFormatter(widthField , widthPercentage , percentFormatter); TextField setIntValueAndFormatter(

```
widthField_, widthFixels_, pixelFormatter_ );
```

* Update the height field. */

```
(void) showHeight {
  if( usePercentages_ ) {
      TextField setDoubleValueAndFormatter(
         heightField_, heightPercentage_,
          percentFormatter_ );
  ) else
```

```
TextField_setIntValueAndFormatter(
   heightField_, heightPixels_, pixelFormatter_ )
```

* Update width and height fields. */

```
(void) showWidthAndHeight {
  [ self showWidth ];
 [ self showHeight ];
```

* Update all controls. */

```
- (void) showAll {
   [ self showWidthAndHeight ];
    usePercentagesBox setState:
        usePercentages ? NSOnState : NSOffState ];
   [ constrainProportionsBox_ setState:
```

* Revert the width and height. This works regardless of the checkbox states. */

(void) revertWidthAndHeight { widthPixels_ = initialWidthPixels_; widthPercentage = 100.0;

heightPixels_ = initialHeightPixels_; heightPercentage = 100.0;

[self showWidthAndHeight];

* The revert button does its work via

```
- (IBAction) revert: (id) sender
   [ self revertWidthAndHeight ];
```

/* Handle the apply button by copying over the width and height. This also sets the percentage values. If we are



```
displaying percentages, then we need to update. We update
                                                                                                                   } else {
                                                   for pixels as well in case this forced any rounding. */
                                                                                                                        heightPixels_ =
                                                                                                                            TextField unformattedIntValue( sender );
                                                  - (IBAction) apply: (id) sender {
                                                                                                                       [ self heightPercentageFromPixels ];
                                                       initialWidthPixels_ = widthPixels_;
                                                      widthPercentage = 100.0;
                                                                                                                   if( constrainProportions ) {
                                                       initialHeightPixels_ = heightPixels_;
                                                                                                                        widthPercentage = heightPercentage;
                                                       heightPercentage = 100.0;
                                                                                                                        [ self widthPixelsFromPercentage ];
                                                                                                                        [ self showWidth ];
                                                      [ self showWidthAndHeight ];
                                                  /* Handle an event from the use percentages checkbox. \ast/
                                                                                                                /* Trigger the text field actions in response to actual
                                                                                                                  hanges.
                                                  - (IBAction) usePercentagesAction: (id) sender {
                                                                                                                       (void) controlTextDidChange:
                                                       BOOL newUsePercentages = [ sender state ] == NSOnState;
                                                      if( newUsePercentages != usePercentages_ ) {
                                                                                                                                   (NSNotification *) notification {
                                                                                                                    id sender = [ notification object ];
                                                           usePercentages = newUsePercentages;
                                                           [ self showWidthAndHeight ];
                                                                                                                   SEL action = [ sender action ];
                                                                                                                   if( action ) {
                                                                                                                       [ [ sender target ]
                                                                                                                              performSelector: action
                                                                                                                               withObject: sender ];
                                                  /* Handle an event from the constrain proportions checkbox.
                                                                                                                   3
                                                  - (IBAction) constrainProportionsAction: (id) sender {
                                                                                                                /* When we start up, we want to set initial values. This
                                                      BOOL newConstrainProportions =
                                                              [ sender state ] == NSOnState;
                                                                                                                would ordinarily be
                                                      if( newConstrainProportions != constrainProportions_
                                                                                                               done by code that was creating the controller and then
                                                          constrainProportions = newConstrainProportions;
                                                                                                               running it with the dialog
                                                           if( newConstrainProportions ) {
                                                                                                                NIB, but we aren't worrying about that here. */
                                                              [ self revertWidthAndHeight ];
                                                                                                                - (void) awakeFromNib {
                                                                                                                   initialWidthPixels_ = widthPixels_ = 400;
                                                                                                                    initialHeightPixels_ = heightPixels_ = 300;
                                                                                                                   widthPercentage = 100.0;
                                                                                                                    heightPercentage = 100.0;
                                                  /* The following routines handle conversion between pixels
                                                                                                                    constrainProportions_ = YES;
                                                  and percentages for width and height. */
                                                                                                                    usePercentages = NO;
                                                                                                                    [ self showAll ];
                                                   - (void) widthPixelsFromPercentage
                                                      widthPixels = (int)
                                                          floor( initialWidthPixels_ * widthPercentage_
                                                                                                                fend
                                                                    / 100.0 + 0.5 );
                                                   - (void) widthPercentageFromPixels {
                                                      widthPercentage =
                                                          widthPixels_ * 100.0 / initialWidthPixels_;
                                                   - (void) heightPixelsFromPercentage {
                                                      heightPixels = (int)
                                                          floor( initialHeightPixels_ * heightPercentage_
                                                                    / 100.0 + 0.5 );
                                                  - (void) heightPercentageFromPixels {
                                                      heightPercentage =
                                                           heightPixels_ * 100.0 / initialHeightPixels_;
constrainProportions_ ? NSOnState : NSOffState ]; /* Process a change to the width field. */
                                                  - (IBAction) widthAction: (id) sender {
                                                      if( usePercentages_ ) {
                                                          widthPercentage =
                                                              TextField unformattedDoubleValue( sender );
                                                          [ self widthPixelsFromPercentage ];
                                                       } else {
                                                          widthPixels_ =
                                                              TextField_unformattedIntValue( sender );
                                                           [ self widthPercentageFromPixels ];
                                                      if( constrainProportions_ ) {
                                                          heightPercentage = widthPercentage
                                                           [ self heightPixelsFromPercentage ];
                                                           [ self showHeight ];
                                                  - }
                                                  /* Process a change to the height field. */
                                                  - (IBAction) heightAction: (id) sender {
                                                      if( usePercentages ) {
                                                           heightPercentage_
                                                              TextField unformattedDoubleValue( sender );
                                                          [ self heightPixelsFromPercentage 1:
```



Declarative Solution using the Property Model Library

```
sheet mini_image_size
input:
      original_width : 5 * 300;
      original_height : 7 * 300;
interface:
      constrain
                       : true;
                                             <== round(width_pixels);</pre>
                       : original_width
      width_pixels
      height_pixels
                       : original_height
                                             <== round(height_pixels);</pre>
      width_percent;
      height_percent;
logic:
      relate {
                           <== round(width_percent * original_width / 100);</pre>
          width_pixels
          width_percent <== width_pixels * 100 / original_width;</pre>
      relate {
                           <== round(height_percent * original_height / 100);</pre>
          height_pixels
         height_percent <== height_pixels * 100 / original_height;
      when (constrain) relate {
          width_percent <== height_percent;</pre>
          height_percent <== width_percent;
output:
      result <== { height: height_pixels, width: width_pixels };</pre>
```

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Where do programming languages need to go

- Major shift from developer productivity to code efficiency
- Locality, locality, locality •
 - Data oriented, array based •
- Value semantics with safe mutability
 - Reference semantics and garbage collectors are problematic
- Computation kernels •
 - Supporting SIMD and GPU code generation
 - See Halide language





Example of Halide

Func blur_3x3(Func input) {
 Func blur_x, blur_y;
 Var x, y, xi, yi;

// The algorithm - no storage or order
blur_x(x, y) = (input(x-1, y) + input(x, y) + input(x+1, y))/3;
blur_y(x, y) = (blur_x(x, y-1) + blur_x(x, y) + blur_x(x, y+1))/3;

// The schedule - defines order, locality; implies storage
blur_y.tile(x, y, xi, yi, 256, 32)
 .vectorize(xi, 8).parallel(y);
blur_x.compute_at(blur_y, x).vectorize(x, 8);

```
return blur_y;
```

```
order
nput(x, y) + input(x+1, y))/3;
olur_x(x, y) + blur_x(x, y+1))/3;
locality; implies storage
)
y);
orize(x, 8);
```



blur_3x3 = [2] => (([-1, 0] + [0, 0] + [1, 0]) / 3) |



(([0, -1] + [0, 0] + [0, 1]) / 3);

Where do programming languages need to go

- Switch emphasis from safety to correctness
 - Higher level semantics allows for more optimization
- Graph based •
 - Ability to control flow between software components
- Shift from functions to relationships



Machine Learning - the wild card

- CoreML (Apple)
- DirectML (Microsoft)
- Neural Engine (Apple)
- TPU (Google)



About the artist

UV Zhu

With an eye for the abstract, Chinese artist UV Zhu remixes patterns, textures, and colors to explore the future of fashion. Using Adobe Photoshop, Adobe Illustrator, and Maxon Cinema 4D, he blends surreal settings, organic shapes, and even favorite foods to challenge convention. Inspired by his travels—around the Internet and in real life—for this piece, UV fantasized about characters moving through an imaginary world, the things they might do, and what they might wear. The result is a bright, colorful expression of joy and positivity.

Made with









Artwork by **UV Zhu** / China





