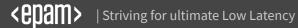


# STRIVING FOR ULTIMATE LOW LATENCY MPH

INTRODUCTION TO DEVELOPMENT OF LOW LATENCY SYSTEMS

Mateusz Pusz September 18, 2017

### **LATENCY VS THROUGHPUT**



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Especially important for internet connections utilizing services such as **trading**, **online gaming** and **VoIP**.



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- In online gaming a player with a high latency internet connection may show slow responses in spite of superior tactics or the appropriate reaction time
- Within capital markets the proliferation of algorithmic trading requires firms to react to market events faster than the competition to increase profitability of trades

# **HIGH-FREQUENCY TRADING (HFT)**

A program trading platform that uses powerful computers to transact a large number of orders at very fast speeds

-- Investopedia

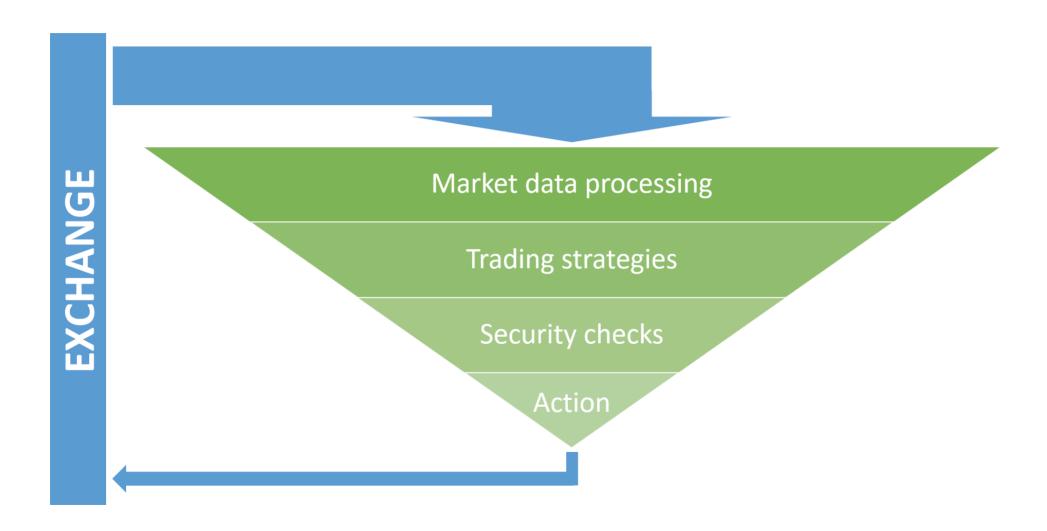
# **HIGH-FREQUENCY TRADING (HFT)**

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- Using *complex algorithms* to analyze multiple markets and execute orders based on market conditions
- Buying and selling of securities many times over a period of time (often hundreds of times an hour)
- Done to *profit from time-sensitive opportunities* that arise during trading hours
- Implies *high turnover of capital* (i.e. one's entire capital or more in a single day)
- Typically, the traders with the fastest execution speeds are more profitable

#### **MARKET DATA PROCESSING**



#### **HOW FAST DO WE DO?**

**ALL SOFTWARE APPROACH** 

1-10us

**ALL HARDWARE APPROACH** 

100-1000ns

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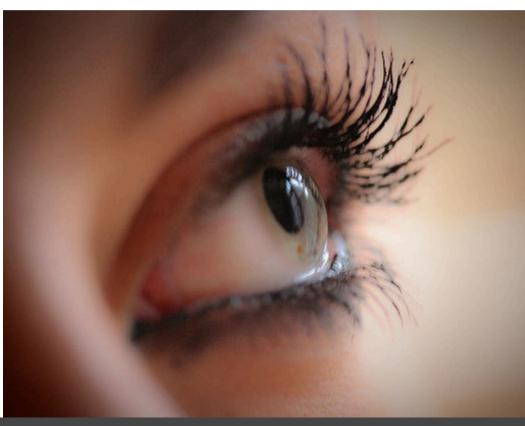
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#### **HOW FAST DO WE DO?**

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#### **ALL HARDWARE APPROACH**

#### 100-1000ns

- Average human eye blink takes 350 000us (1/3s)
- Millions of orders can be traded that time

# WHAT IF SOMETHING GOES WRONG?



#### WHAT IF SOMETHING GOES WRONG?

#### **KNIGHT CAPITAL**

- In 2012 was the largest trader in
   U.S. equities
- Market share
  - 17.3% on NYSE
  - 16.9% on NASDAQ
- Had approximately \$365 million in cash and equivalents
- Average daily trading volume
  - 3.3 billion trades
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  - trading over 21 billion dollars
- pre-tax loss of \$440 million in 45 minutes

-- LinkedIn



How a software bug made Knight Capital lose \$500M in a day & almost go bankrupt

#### C++ OFTEN NOT THE MOST IMPORTANT PART OF THE SYSTEM

- Low Latency network
- Modern hardware
- BIOS profiling
- Kernel profiling
- OS profiling

### SPIN, PIN, AND DROP-IN

#### **SPIN**

- Don't sleep
- Don't context switch
- Prefer single-threaded scheduling
- Disable locking and thread support
- Disable power management
- Disable C-states
- Disable interrupt coalescing

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- Assign interrupt affinity
- Assign memory to NUMA nodes
- Consider the physical location of NICs
- Isolate cores from general OS use
- Use a system with a single physical CPU

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#### **DROP-IN**

- Choose NIC vendors based on performance and availability of drop-in kernel bypass libraries
- Use the kernel bypass library



# LET'S SCOPE ON THE SOFTWARE

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     shares network
- Mistakes are really costly
  - good error checking and recovery is mandatory
  - one second is 4 billion CPU instructions (a lot can happen that time)

# HOW TO DEVELOP SOFTWARE THAT HAVE PREDICTABLE PERFORMANCE?



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It turns out that the more important question here is...



# HOW NOT TO DEVELOP SOFTWARE THAT HAVE PREDICTABLE PERFORMANCE?



# HOW NOT TO DEVELOP SOFTWARE THAT HAVE PREDICTABLE PERFORMANCE?

- In Low Latency system we care a lot about
   WCET (Worst Case Execution Time)
- In order to limit WCET we should limit the usage of specific C++ language features
- This is not only the task for developers but also for code architects



#### THINGS TO AVOID ON THE FAST PATH

- 1 C++ tools that trade performance for usability (e.g. std::shared\_ptr<T>, std::function<>)
- 2 Throwing exceptions on likely code path
- 3 Dynamic polymorphism
- 4 Multiple inheritance
- 5 RTTI
- 6 Dynamic memory allocations

# std::shared\_ptr<T>

```
template<class T>
class shared_ptr;
```

- Smart pointer that retains **shared ownership** of an object through a pointer
- Several shared\_ptr objects may own the same object
- The shared object is destroyed and its memory deallocated when the last remaining **shared\_ptr** owning that object is either destroyed or assigned another pointer via **operator=** or **reset()**
- Support user provided deleter

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## Too often overused by C++ programmers

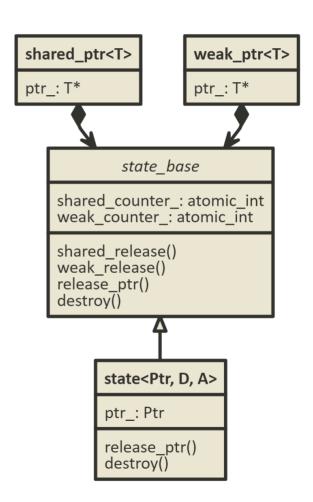
## **QUESTION: WHAT IS THE DIFFERENCE HERE?**

```
void foo()
{
   std::unique_ptr<int> ptr{new int{1}};
   // some code using 'ptr'
}
```

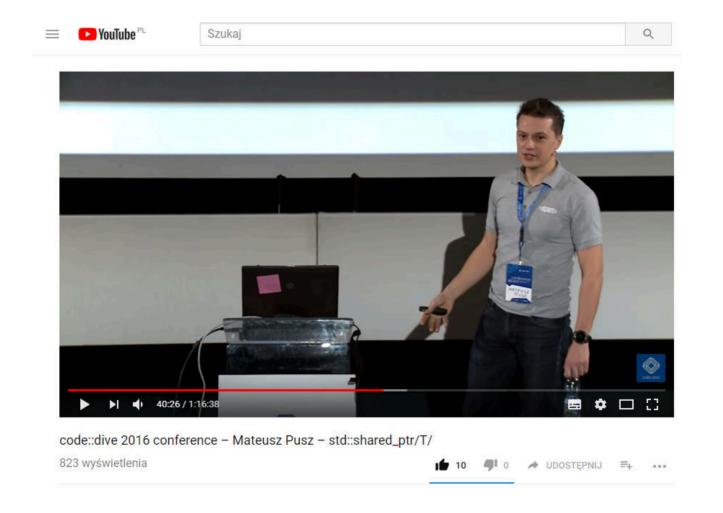
```
void foo()
{
   std::shared_ptr<int> ptr{new int{1}};
   // some code using 'ptr'
}
```

# KEY std::shared\_ptr<T> ISSUES

- Shared state
  - performance + memory footprint
- Mandatory synchronization
  - performance
- Type Erasure
  - performance
- std::weak\_ptr<T> support
  - memory footprint
- Aliasing constructor
  - memory footprint



# **MORE INFO ON CODE::DIVE 2016**





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Not using C++ exceptions is not an excuse to write not exception-safe code!

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### **POLYMORPHISM**

#### **DYNAMIC**

```
class base {
  virtual void setup() = 0;
  virtual void run() = 0;
  virtual void cleanup() = 0;
public:
  virtual ~base() = default;
  void process()
     setup();
     run();
     cleanup();
class derived : public base {
  void setup() override { /* ... */ }
void run() override { /* ... */ }
void cleanup() override { /* ... */ }
};
```

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};
```

- Additional pointer stored in an object
- Extra indirection (pointer dereference)
- Often not possible to devirtualize
- Not inlined
- Instruction cache miss

### **POLYMORPHISM**

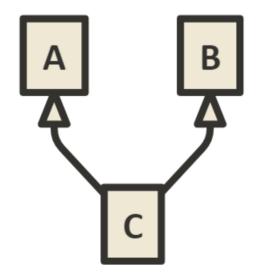
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class derived : public base {
  void setup() override { /* ... */ }
void run() override { /* ... */ }
  void cleanup() override { /* ... */ }
};
```

#### **STATIC**

```
template<class Derived>
class base {
public:
  void process()
    static cast<Derived*>(this)->setup();
    static cast<Derived*>(this)->run();
    static cast<Derived*>(this)->cleanup();
class derived : public base<derived> {
  friend class base<derived>;
 void setup() { /* ... */ }
void run() { /* ... */ }
  void cleanup() \{ /* ... */ \}
```

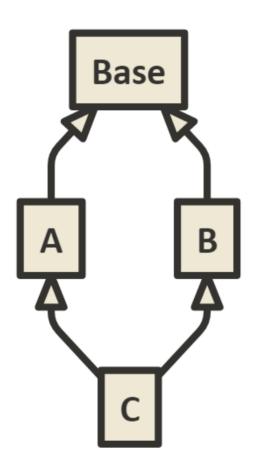
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 this pointer adjustments needed to call member function (for not empty base classes)

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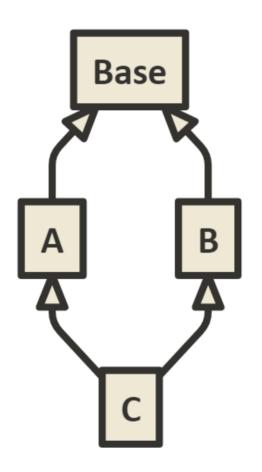
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- Virtual inheritance as an answer
- virtual in C++ means "determined at runtime"
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#### **DIAMOND OF DREAD**

- Virtual inheritance as an answer
- virtual in C++ means "determined at runtime"
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Always consider composition before inheritance!

```
class base {
public:
   virtual ~base() = default;
   virtual void foo() = 0;
};
```

```
class derived : public base {
public:
  void foo() override;
  void boo();
};
```

```
class base {
public:
   virtual ~base() = default;
   virtual void foo() = 0;
};
```

```
class derived : public base {
public:
  void foo() override;
  void boo();
};
```

```
void foo(base& b)
{
  derived* d = dynamic_cast<derived*>(&b);
  if(d) {
    d->boo();
  }
}
```

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Often the sign of a *smelly* design

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- Traversing an inheritance tree
- Comparisons

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}
```

void foo(base& b)
{
 if(typeid(b) == typeid(derived)) {
 derived\* d = static\_cast<derived\*>(&b);
 d->boo();
 }
}

- Traversing an inheritance tree
- Comparisons

- Only one comparison of std::type\_info
- Often only one runtime pointer compare

## **DYNAMIC MEMORY ALLOCATIONS**

- General purpose operation
- *Nondeterministic* execution performance
- Causes memory fragmentation
- Memory leaks possible if not properly handled
- May fail (error handling is needed)

### **CUSTOM ALLOCATORS TO THE RESCUE**

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- Typically *low number of* dynamic memory *allocations*
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template<typename T> struct pool_allocator {
   T* allocate(std::size_t n);
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using pool_string = std::basic_string<char, std::char_traits<char>, pool_allocator>;
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<u>Preallocation</u> makes the allocator *jitter more stable*, helps in keeping *related data together* and avoiding long term *fragmentation*.

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Prevent dynamic memory allocation for the (common) case of dealing with small objects

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```
class sso_string {
  char* data_ = u_.sso_;
  size_t size_ = 0;
  union {
    char sso_[16] = "";
    size_t capacity_;
  } u_;
  public:
    size_t capacity() const { return data_ == u_.sso_ ? sizeof(u_.sso_) - 1 : u_.capacity_; }
  // ...
};
```

## NO DYNAMIC ALLOCATION

```
template<std::size_t MaxSize>
class inplace_string {
   std::array<value_type, MaxSize + 1> chars_;
public:
   // string-like interface
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struct db_contact {
  inplace_string<7> symbol;
  inplace_string<15> name;
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No dynamic memory allocations or pointer indirections guaranteed with the cost of possibly bigger memory usage



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- Measure performance... ALWAYS

# THE MOST IMPORTANT RECOMMENDATION



# THE MOST IMPORTANT RECOMMENDATION

Always measure your performance!

Always measure Release version

```
cmake -DCMAKE_BUILD_TYPE=Release
cmake -DCMAKE_BUILD_TYPE=RelWithDebInfo
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- In case that is not possible or you want to debug specific performance issue use *profiler*
- To gather meaningful stack traces *preserve frame pointer*

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   "${CMAKE_CXX_FLAGS_RELWITHDEBINFO} -fno-omit-frame-pointer")
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- Familiarize yourself with linux perf tools (xperf on Windows) and flame graphs
- Use tools like Intel VTune

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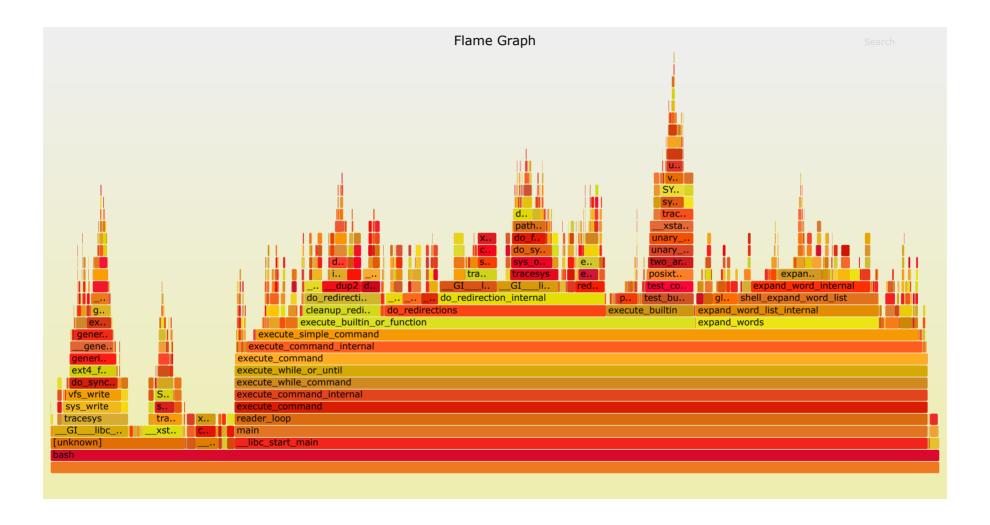
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- Use tools like Intel VTune
- Verify output assembly code

# **FLAMEGRAPH**





# CAUTION **Programming** is addictive (and too much fun)