# Performance in a High-throughput SQL Database

Real-world Profiler Tips

Zach Musgrave, DoltHub GopherCon 2022

#### Agenda

- 1. Introduction
- 2. Using the profiler toolchain
- 3. Performance case studies
- 4. High performance tuple store

#### Introduction

#### Who am I?

Zach Musgrave: project lead for Dolt

DoltHub: 20 person database startup

Formerly: Google (award-winning memer),

Amazon (award-winning developer)

Gopher of ~4 years

#### What's Dolt?

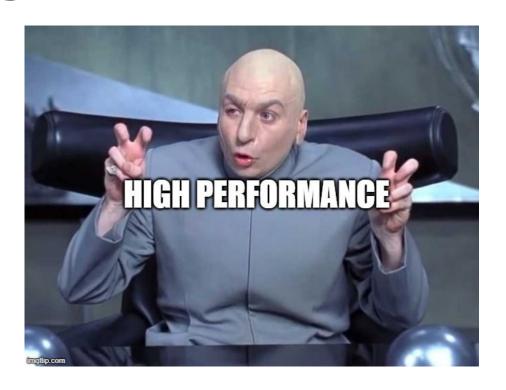


The world's first SQL database you can branch, merge, fork, clone, push, pull like a git repository

Torvalds sarcastically quipped about the name git (which means "unpleasant person" in British English slang):

"I'm an egotistical bastard, and I name all my projects after myself. First 'Linux', now 'git'."

# A high performance tuple store



#### Why is that hard?

**grauenwolf** 1d

I'll up vote it for a good write up. But WTF are you building your own database? Unless you have a very, very specific scenario, just don't.



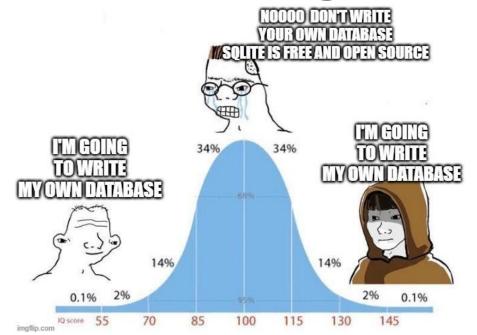
my\_password\_is\_\_\_\_\_ 21h

why would anyone vote this down its the correct thinking

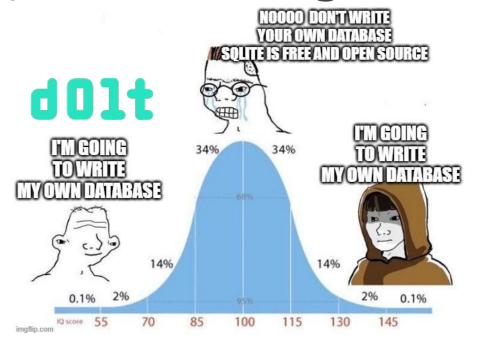
sqlite is free and open source postgresql is free and open source

why build your own LOL

### Why are we doing this?



# Why are we doing this?



# Using the profiler

# The golang profiler

#### Two parts:

- runtime/pprof: profile your application
- go tool pprof: analyze profiler dumps

#### Instrumenting your code

```
import "runtime/pprof"
func main() {
    profileWr = os.Create("/tmp/profile.prof")
    pprof.StartCPUProfile(profileWr)
    mainLogic()
    pprof.StopCPUProfile()
```

#### Better: use a library

go get github.com/pkg/profile

#### Even better: add profiler flags

```
func main() {
    args := os.Args[1:]
    if len(args) > 0 {
        switch args[0] {
        case profFlag:
            switch args[1] {
            case cpuProf:
                defer profile. Start (profile. CPUProfile,
                   profile.NoShutdownHook).Stop()
            case memProf:
                defer profile.Start(profile.MemProfile,
                   profile.NoShutdownHook).Stop()
            args = args[2:]
```

#### Profiler flags cont.

% dolt --prof cpu % dolt --prof memory

- Other good options: custom environment variables or cues
- Bad option: changing your code to run the profiler

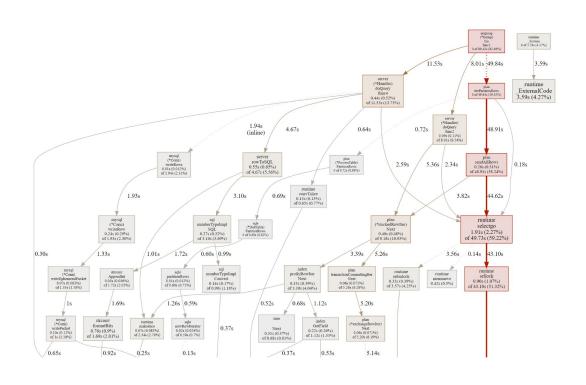
#### Running pprof

Basic invocation:

go tool pprof <options> cpu.pprof

Ignore all options and run -http:8080

#### Demo: using pprof http server



# Performance profiling case studies

#### Case study: interface assertion

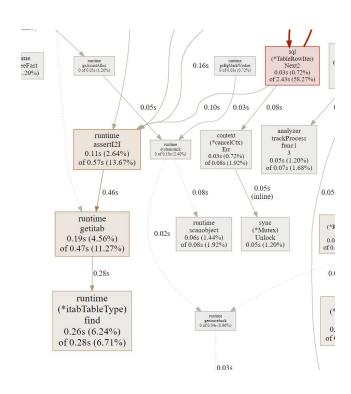
```
type RowIter interface {
    Next(ctx *Context) (Row, error)
}

type RowIter2 interface {
    RowIter
    Next2(ctx *Context, frame *RowFrame) error
}
```

#### Case study: interface assertion

```
type iter struct {
    childIter sql.RowIter
func (t iter) Next2(
        ctx *sql.Context,
        frame *sql.RowFrame,
) error {
   return t.childIter.(sql.RowIter2).Next2(ctx, frame)
```

#### Profiler demo



#### Solution: remove type assertions

```
type iter struct {
    childIter sql.RowIter
    childIter2 sql.RowIter2
func (t iter) Next(...) {
    return t.childIter.Next(ctx)
func (t iter) Next2(...) {
    return t.childIter2.Next2(ctx, frame)
```

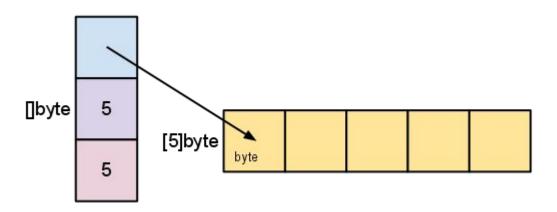
#### Case study: working with slices

```
func sumArray() uint64 {
    a := randArray()
    var sum uint64
    for i := range a {
        sum += uint64(a[i].(byte))
    }
    return sum
}
```

# Worst: appending to a slice

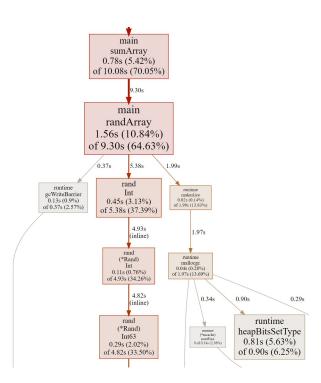
```
main
                                                                                                                           sumArray
                                                                                                                         0.57s (2.44%)
                                                                                                                        of 12.58s (53.88%)
func randArray() []interface{} {
                                                                                                                              12.01s
          var a []interface{}
                                                                                                                            main
                                                                                                                         randArray
          for i := 0; i < 1000; i++ {
                                                                                                                        1.32s (5.65%)
                                                                                                                      of 12.01s (51.43%)
                    a = append(a, byte(rand.Int() % 255))
                                                                                                                              5.64s 0.41s
                                                                                                                                           4.63s
                                                                                                                                              rand
                                                                                                                                              Int
                                                                                                                           growslice
                                                                                                                          0.12s (0.51%)
                                                                                                                                           0.56s (2.40%)
          return a
                                                                                                                          of 5.64s (24.15%)
                                                                                                                                          of 4.63s (19.83%)
                                                                                                                                     runtime
                                                                                                                                   gcWriteBarrier
                                                                                                                                                4.05s
                                                                                                                  1.16s
                                                                                                                          0.18s 4.16s
                                                                                                                                   0.11s (0.47%)
                                                                                                                                               (inline)
                                                                                                                                   of 0.42s (1.80%)
                                                                                                                                              rand
                                                                                                                            runtime
                                                                                                                runtime
                                                                                                                                             (*Rand)
                                                                                                                            mallocge
                                                                                                               memmove
                                                                                                                                              Int
                                                                                                                           0.15s (0.64%)
                                                                                                                                            0.11s (0.47%)
                                                                                                              0.19s (0.81%)
                                                                                                                          of 4.16s (17.82%)
                                                                                                                                           of 4.05s (17.34%)
                                                                                                          .67s
                                                                                                                            1.73s
                                                                                                                                               (inline)
                                                                                                                     runtime
                                                                                                                                              rand
                                                                                                                 heapBitsSetType
                                                                                                                                             (*Rand)
                                                                                                                                              Int63
                                                                                                                  1.61s (6.90%)
                                                                                                                                            0.26s (1.11%)
                                                                                                                                           of 3.94s (16.87%)
                                                                                                                 of 1.73s (7.41%)
```

# Growing a slice is slow



#### Better: static slice size

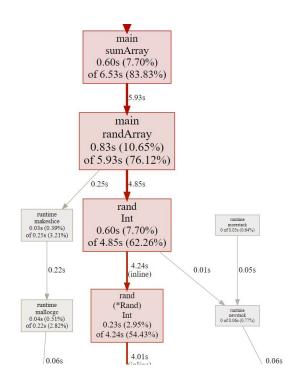
```
func randArray() []interface{} {
    a := make([]interface{}, 1000)
    for i := 0; i < len(a); i++ {
        a[i] = byte(rand.Int() % 255)
    return a
```





#### Even better: don't use interface{}

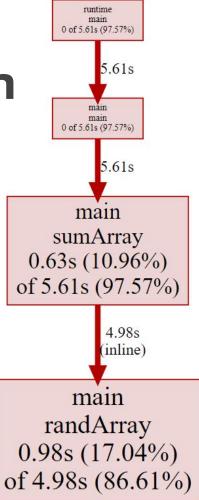
```
func randArray() []byte {
    a := make([]byte, 1000)
    for i := 0; i < len(a); i++ {
        a[i] = byte(rand.Int() % 255)
    return a
```





#### Best: pass a slice param

```
func randArray(a []interface{}) {
    for i := 0; i < len(a); i++ {
        a[i] = byte(rand.Int() % 255)
    }
}</pre>
```



#### Slice operation efficiency

- Appending: 20%
- Static slice with interface{}: 38%
- Static slice with byte: 62%
- Slice as param: 70%

#### Case study: struct as receiver

```
func (b bigStruct) randFloat() float32 {
    x := rand.Float32()
    return x
}
func (b *bigStruct) randFloat() float32 {
    x := rand.Float32()
    return x
}
```



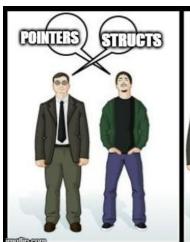
#### Case study: struct as receiver















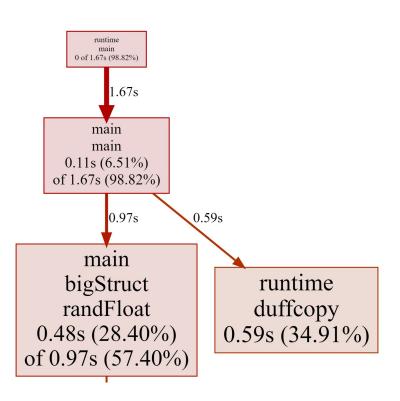
# Let's be civil

	Pros	Cons
Structs	✓Stays on the stack ✓Immutable	XMore memory to copy
Pointers	✓Mutable ✓Less memory to copy	XGoes on the heap  ✓
Both	✓ Choose your own adventure ✓ Irritate pedants	Xgo vet warnings Xpedant is your tech lead

#### I thought this was a talk on performance

```
type bigStruct struct {
    v1, v2, v3, v4, v5, v6, v7, v8, v9uint64
    f1, f2, f3, f4, f5, f6, f7, f8, f9float64
   b1, b2, b3, b4, b5, b6, b7, b8, b9[]byte
    s1, s2, s3, s4, s5, s6, s7, s8, s9string
func (b bigStruct) randFloat() float64 {
    x := rand.Float32()
    switch {
   case x < .1:
       return b.f1
```

#### Profiler demo





```
send(to, from, count)
register short *to, *from;
register count;
   register n = (count + 7) / 8;
   switch (count % 8) {
   case 0: do { *to = *from++;
           *to = *from++;
   case 7:
   case 6:     *to = *from++;
   case 5: *to = *from++;
           *to = *from++;
   case 4:
   case 3:
           *to = *from++;
   case 2: *to = *from++;
                *to = *from++;
   case 1:
           } while (--n > 0);
```

#### src/runtime/mkduff.go:

```
// runtime.duffcopy is a Duff's device for copying memory.
// The compiler jumps to computed addresses within
// the routine to copy chunks of memory.
// Source and destination must not overlap.
// Do not change duffcopy without also
// changing the uses in cmd/compile/internal/*/*.go.
```

#### Tom Duff



- Canadians born in 50s
- University of Toronto
- Bell Labs
- Plan 9



#### Rob Pike





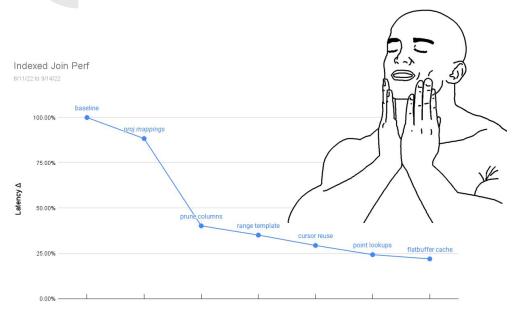
#### Solution: use a pointer receiver

```
func (b *bigStruct) randFloat() float32 {
    x := rand.Float32()
    return x
}
```



Deep dive: Profiling a high-performance tuple store

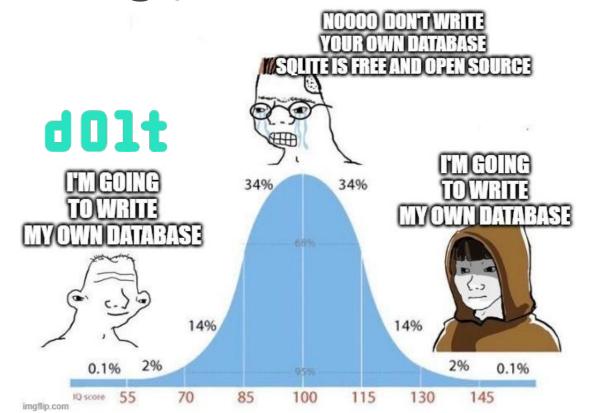
## The limits of profiling



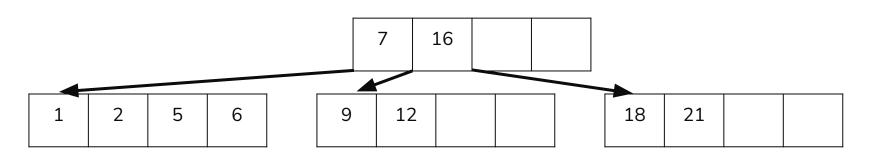
just one more lane bro. i promise bro just one more lane and it'll fix everything bro. bro. just one more lane. please just one more. one more lane and we can fix this whole problem bro. bro cmon just give me one more lane i promise bro. bro bro please i just need one more lane t



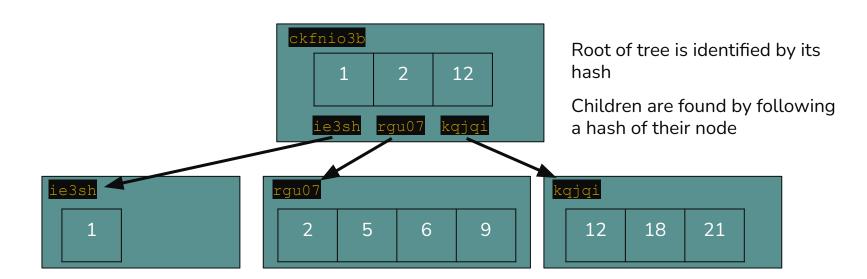
## Writing your own database



#### **B-Trees**



#### **Prolly Trees**

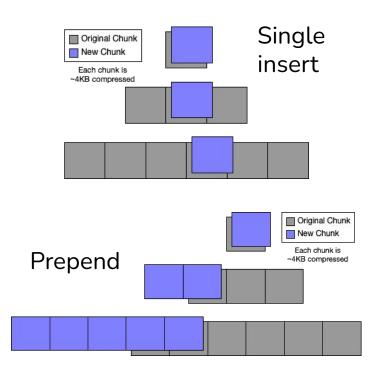


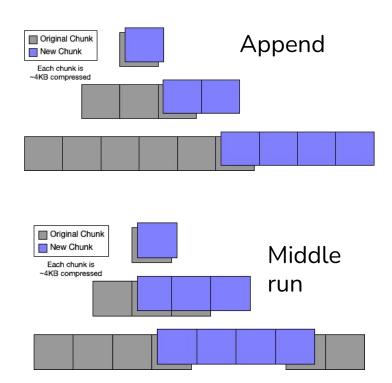
#### Building a prolly tree

We build a prolly tree by separating it into chunks based on a rolling hash of the contents. When the hash falls below a certain threshold, start a new chunk. Choose a threshold to get an (average) desired chunk size

Hash		4	40	107	125	3	109	88	60
Content		1	2	5	6	9	12	18	21
	•								

#### Structural sharing





## Problems with original architecture

IOMS

Too general: graph storage v. tabular

Too verbose: expensive to deserialize

Too much overhead: limits branching factor

#### Table data

ID (tag=3)	First_name (tag=10)	Last_name (tag=4)
1	Zach	Musgrave
2	Aaron	Son
3	Cher	

```
{
        (3,1) => (10, "Zach", 4, "Musgrave"),
        (3,2) => (10, "Aaron", 4, "Son"),
        (3,3) => (10, "Cher"),
}
```

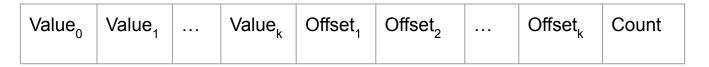
## Self-describing serialization

## Deserializing noms objects

Type <sub>0</sub>	Length <sub>0</sub>	Value <sub>0</sub>	Type <sub>1</sub>	Length <sub>1</sub>	Value <sub>1</sub>	

- 1) Read type + length
- 2) Instantiate appropriate deserializer for type
- 3) Repeat for entire array
- O(N) access time for any element (1st load)

## New tuple storage



Types stored out of band in schema object

Each offset is uint16 (65k max row size)

O(1) random access inside a row

## New object storage

Flatbuffers:

Zero-deserialization (!!) persistence

Sounds too good to be true but somehow works



### Flatbuffers example

```
table ProllyTreeNode {
  key_items:[ubyte] (required);
  key_offsets:[uint16] (required);
  value_items:[ubyte];
  value_offsets:[uint16];
  value_address_offsets:[uint16];
  address_array:[ubyte];
```

#### Flatbuffer results

Format	Ops	Time	Mem	Allocs
Old	19893	60952 ns/op	21086 B/op	484 allocs/op
Flatbuffers	183279	7199 ns/op	544 B/op	5 allocs/op
Proto	153792	10043 ns/op	6912 B/op	22 allocs/op

10x faster than old format

30% faster than proto 90% less memory allocated

## Performance metrics: reads

Read Tests	MySQL	Dolt	Multiple
Read Tests	MySQL	Dott	Muttiple
covering_index_scan	1.96	6.55	3.3
groupby_scan	12.52	22.69	1.8
index_join	1.18	16.71	14.2
index_join_scan	1.12	16.12	14.4
index_scan	30.26	73.13	2.4
oltp_point_select	0.15	0.57	3.8
oltp_read_only	3.02	9.56	3.2
select_random_points	0.31	1.39	4.5
select_random_ranges	0.36	1.37	3.8
table_scan	30.81	69.29	2.2
types_table_scan	69.29	223.34	3.2
reads_mean_multiplier			5.2

Read Tests	MySQL	Dolt	Multiple
covering_index_scan	1.93	2.76	1.4
groupby_scan	12.08	17.32	1.4
index_join	1.18	4.57	3.9
index_join_scan	1.12	3.89	3.5
index_scan	30.26	53.85	1.8
oltp_point_select	0.15	0.46	3.1
oltp_read_only	2.91	8.28	2.8
select_random_points	0.3	0.74	2.5
select_random_ranges	0.35	1.12	3.2
table_scan	30.81	63.32	2.1
types_table_scan	69.29	193.38	2.8
reads_mean_multiplier			2.6

## Performance metrics: writes

Write Tests	MySQL	Dolt	Multiple	Write Tests	MySQL	Dolt	Multiple
bulk_insert	0.001	0.001	1.0	bulk_insert	0.001	0.001	1.0
oltp_delete_insert	2.81	19.65	7.0	oltp_delete_insert	3.02	10.84	3.6
oltp_insert	1.55	7.98	5.1	oltp_insert	1.58	2.81	1.8
oltp_read_write	5.28	36.89	7.0	oltp_read_write	5.18	16.71	3.2
oltp_update_index	1.58	9.39	5.9	oltp_update_index	1.61	4.91	3.0
oltp_update_non_index	1.47	6.55	4.5	oltp_update_non_index	1.55	5.18	3.3
oltp_write_only	2.39	26.2	11.0	oltp_write_only	2.3	8.28	3.6
types_delete_insert	2.91	155.8	53.5	types_delete_insert	3.13	12.08	3.9
writes_mean_multiplier			11.9	writes_mean_multiplier			2.9

#### **Overall metrics**

50% reduction in read latency

75% reduction in write latency

3x overall speedup

# Thanks for coming!

To learn more: dolthub.com github.com/dolthub/dolt