

MARTIN KLEPPMANN UNIVERSITY OF CAMBRIDGE @martink(



Ink & Switch

### Thank you to my supporters

LEVERHULME TRUST \_\_\_\_\_





Crowdfunding supporters include: Ably, Adrià Arcarons, Chet Corcos, Macrometa, Mintter, David Pollak, Prisma, RelationalAI, SoftwareMill, Talent Formation Network, Adam Wiggins

https://www.patreon.com/martinkl

### Example: Text editing

time



### Example: Text editing

insert "World"

after "Hello"

Hello!

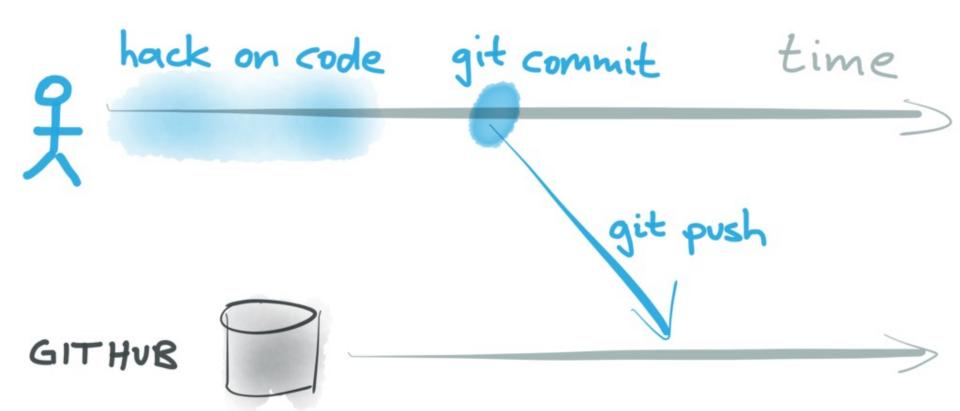
Hello World!

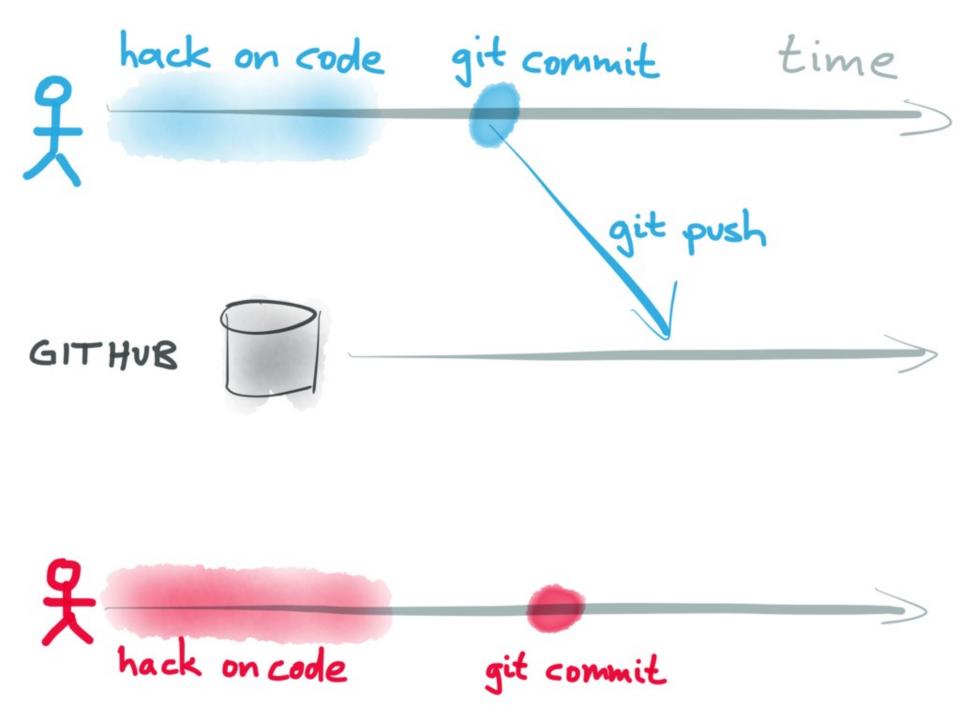
time

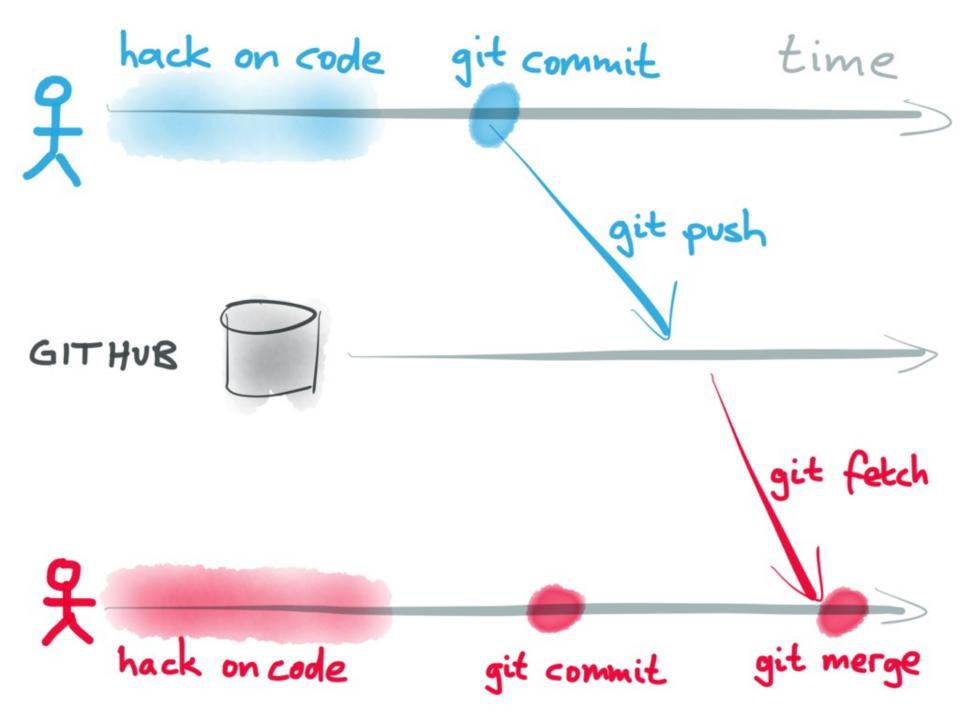
```
"Hello!" "Hello!:-)"
```

### Example: Text editing insert "World" after "Hello" "Hello! "Hello World!" "Hello World! :-)" insert ":-)" after "!" "Hello World!:-)" "Hello! :-)" "Hello!











```
...martin/dev/cl/automerge/test/backend_test_LOCAL_3486.js ...rtin/dev/cl/automerge/test/backend_test_BASE_3486.js ...martin/dev/cl/automerge/test/backend_test_REMOTE_3486.js
     const ROOT ID = '00000000-0000-0000-0000-0000000
                                                           6* const ROOT ID = '00000000-0000-0000-0000-0000000
                                                                                                                      const ROOT ID = '00000000-0000-0000-0000-000000000
                                                                                                                       describe('Automerge.Backend', () => {
     describe('Backend', () => {
                                                              describe( Automerge.Backend , () => {
       describe('incremental diffs', () => {
                                                                                                                         describe('incremental diffs', () => {
                                                                describe('incremental diffs', () => {
         it('should assign to a key in a map', () =>
                                                          10
                                                                  it('should assign to a key in a map', () =>
                                                                                                                          it('should assign to a key in a map', () => {
           const actor = uuid()
                                                                    const actor = uuid()
                                                                                                                             const actor = uuid()
 10
                                                          11
           const change1 = {actor, seq: 1, deps: {},
                                                          129
                                                                    const change1: Change = {
                                                                                                                   12
                                                                                                                             const change1: Change = {
                                                                      actor,
                                                          13
                                                                                                                   13
                                                                                                                               actor,
                                                                                                                   14
                                                          14:
                                                                      seq: 1,
                                                                                                                               seq: 1,
                                                          15*
                                                                      deps: {},
                                                                                                                   15
                                                                                                                               deps: {},
                                                          16*
                                                                                                                   16
                                                                                                                               ops: [
                                                                      ops: [
                                                                                                                   17
                                                          17
                                                          18
                                                                          action: 'set',
                                                                                                                   18
                                                                                                                                   action: 'set',
                                                                          obj: ROOT ID,
                                                                                                                                   obj: ROOT ID,
 12
             {action: 'set', obj: ROOT ID, key: 'bird
                                                          19
                                                                                                                   19
                                                                          key: 'bird',
                                                                                                                   20
                                                                                                                                   key: 'bird'
                                                                                                                                   value: 'magpie',
                                                          21
                                                                          value: 'magpie',
                                                                                                                   21
                                                                                                                   22
                                                                                                                                 } as Op,
                                                                         } as Op,
           1}
                                                                                                                   23
                                                          23
                                                          24
                                                                                                                   24
                                                                    const s0 = Backend.init()
 14
           const s0 = Backend.init()
                                                          25
                                                                                                                   25
                                                                                                                             const s0 = Backend.init()
                                                          26
                                                                                                                             const [s1, patch1] = Backend.applyChanges(s0)
           const [s1, patch1] = Backend.applyChanges(
                                                                    const [s1, patch1] = Backend.applyChanges(
                                                                                                                   26
           assert.deepEqual(patch1, {
                                                                    assert.deepEqual(patch1, {
                                                                                                                             assert.deepEqual(patch1, {
 16
                                                          27
             canUndo: false, canRedo: false, clock: {
                                                          28
                                                                      canUndo: false, canRedo: false, clock: {
                                                                                                                   28
                                                                                                                               canUndo: false,
                                                                                                                   29
                                                                                                                               canRedo: false,
                                                                                                                   30
                                                                                                                               clock: { [actor]: 1 },
                                                                                                                   31
                                                                                                                               deps: { [actor]: 1 },
                                                                                                                               diffs: [
                                                                                                                   32
                                                                                                                   33
                                                                                                                                   action: 'set',
                                                                                                                   34
             diffs: {objectId: ROOT ID, type: 'map',
                                                                      diffs: [{action: 'set', obj: ROOT ID, pa
                                                                                                                   35
                                                                                                                                   obj: ROOT ID,
 19
               bird: {[actor]: {value: 'magpie'}}
                                                                                                                   36
                                                                                                                                   path: [],
 20
                                                                                                                   37
                                                                                                                                   type: 'map'
                                                                                                                   38
                                                                                                                                   key: 'bird'
                                                                                                                   39
                                                                                                                                   value: 'magpie',
                                                                                                                   40
                                                                                                                                 } as Diff,
                                                                                                                   41
 21
                                                          30
           })
                                                                                                                   42
                                                                                                                             })
                                                                  })
                                                                                                                   43
 23
                                                          32
                                                                                                                   44
 24
         it('should increment a key in a map', () =>
                                                          33
                                                                  it('should increment a key in a map', () =>
                                                                                                                   45
                                                                                                                           it('should increment a key in a map', () => {
 25
           const actor = uuid()
                                                          34
                                                                    const actor = uuid()
                                                                                                                   46
                                                                                                                             const actor = uuid()
 26
           const changel = {actor, seq: 1, deps: {},
                                                          35*
                                                                    const change1: Change = {
                                                                                                                   47
                                                                                                                             const change1: Change = {
                                                          36*
                                                                      actor,
                                                                                                                   48
                                                                                                                               actor,
                                                          37*
                                                                      seq: 1,
                                                                                                                   49
                                                                                                                               seq: 1
```

Changes: 17; Conflicts: 35

Reference View (Files as Loaded) Edit

Edit View (Merge Result)

Ruleset: Default

default

## COLLABORATIVE APPLICATIONS







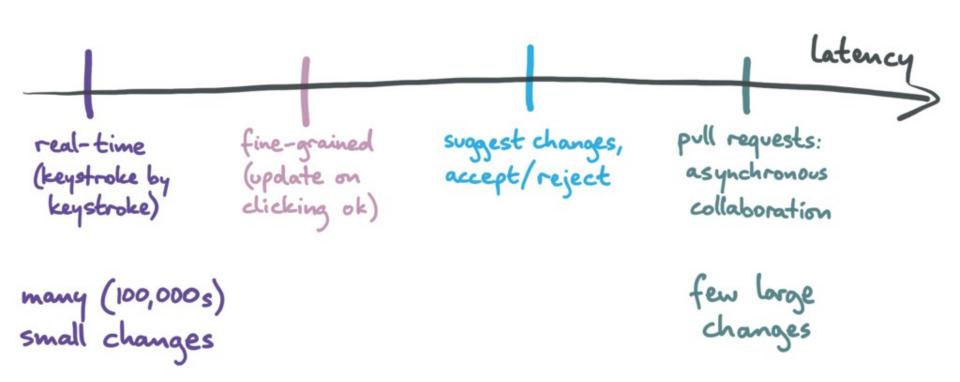






# Collaboration

Syncing changes between several users



```
{"todos":[

{"title": "buy milk",

"done": false},

{"title": "water plants",

"done": false}

]}
```

#### AUTOMERGE:

#### Branching and merging

```
USER A:
                                           {"todos":[
Automerge. change
                                            {"title": "buy milk",
"done": false},
                                             {"title": "water plants",
                                              "done": true }
{"todos":[
 {"title": "buy milk",
  "done": false},
 {"title": "water plants",
   "done": false}
```

### Automerge. change {"todos":[ {"title": "buy milk", "done": false }, {"title": "water plants", "done": false} Automerge. change

```
SER A:

{"todos":[

{"title": "buy milk",

"done": false},

{"title": "water plants",

"done": true}

]}
```

#### USER B:

```
{"todos":[

{"title": "buy milk",

"done": false},

{"title": "water plants",

"done": false},

{"title": "do laundry",

"done: false}
]
```

#### AUTOMERGE:

#### Branching and merging

```
USER A:
                                        {"todos":[
Automerge. change
                                         {"title": "buy milk",
                                           "done": false},
                                          {"title": "water plants",
                                           "done": true }
{"todos":[
                                                                                  {"todos":[
 {"title": "buy milk",
                                                                                    {"title": "buy milk",
  "done": false },
                                                                                     "done": false },
 {"title": "water plants",
                                                                                    {"title": "water plants",
   "done": false}
                                                                merge
                                                                                     "done": true },
                                                                                    {"title": "do Laundry",
                                         USER B:
                                                                                     "done: false}
                                         {"todos":[
                                          {"title": "buy milk",
                                           "done": false },
                                           {"title": "water plants",
  Automerge. change
                                            "done": false },
                                          {"title": "do Laundry",
```

"done: false}



https://github.com/automerge/automerge

### AUTOMERGE: "Git for your app's data"

```
{"todos": [
{"title": "buy milk", "done": false},
{"title": "water plants", "done": false}
```

### AUTOMERGE: "Git for your app's data"

```
{"todos": [
{"title": "buy milk", "done": false},
{"title": "water plants", "done": false}
}
```

```
after = Automerge.change (before, "add new item", doc => {
    doc.todos.push ({title: "do (aundry", done: false});
})
```

```
AUTOMERGE: "Git for your app's data"
{ "todos": L
 {"title": "buy milk", "done": false},
   { "title": "water plants", "done": false},
 {"title": "do laundry", "done": false}
                                            e added
```

```
after = Automerge.change (before, "add new item", doc => {
    doc.todos.push ({\text{title}: "do (aundry", done: false});
});
```

```
AUTOMERGE: "Git for your app's data"
{"todos": L
 {"title": "buy milk", "done": false },
   {"title": "water plants", "done": false},
 {"title": "do laundry", "done": false}
                                            added
```

after = Automerge.change (before, "add new item", doc => {

doc.todos.push ({\text{title: "do (aundry", done: false});}

append item to list

```
operation
```

```
{op: "make Map", id: "5a", obj: "1a", elemID: "2a", insert: true}
{op: "assign", id: "6a", obj: "5a", key: "title", value: "do laundry"}
{op: "assign", id: "7a", obj: "5a", key: "done", value: false}
```

```
operation log
```

```
{ορ: "make Hap", id: "5a", obj: "1a", elemID: "2a", insert: true}
{ορ: "assign", id: "6a", obj: "5a", key: "title", value: "do laundry"}
{ορ: "assign", id: "7a", obj: "5a", key: "done", value: false}
```

compressed binary encoding Uint8Array ([0x85, 0x6f, 0x4a, 0x93, ...])

operation

```
{ορ: "make Hap", id: "5a", obj: "1a", elemID: "2a", insert: true}
{ορ: "assign", id: "6a", obj: "5a", key: "title", value: "do laundry"}
{ορ: "assign", id: "7a", obj: "5a", key: "done", value: false}
```

compressed binary encoding Uint8Array ([0x85, 0x6f, 0x4a, 0x93, ...])

write to disk, send over network

```
{op: "make Map", id: "la"}
{op: "assign", id: "2a", obj: "la", key: "title", value: "Water plants", overwrites:[]}
{op: "assign", id: "3a", obj: "la", key: "done", value: false, overwrites: []}
```

```
{op: "make Map", id: "la"}
{op: "assign", id: "2a", obj: "la", key: "title", value: "Water plants", overwrites:[]}
{op: "assign", id: "3a", obj: "la", key: "done", value: false, overwrites: []}
```

### doc.todos[0]. done = true

```
{op: "assign", id: "4a", obj: "1a", key: "done", value: true, overwrites: ["3a"]}
```

```
{op: "make Map", id: "la" }
{op: "assign", id: "2a" obj: "la" key: "title", value: "Water plants", overwrites:[]}
{op: "assign", id: "3a", obj: "la" key: "done", value: false, overwrites: []}
```

### doc.todos[0]. done = true

{op: "assign", id: "4a", obj: "1a", key: "done", value: true, overwrites: ["3a"]}

```
{op: "make Map", id: "la"}
{op: "assign", id: "2a", obj: "la", key: "title", value: "Water plants", overwrites:[]}
{op: "assign", id: "3a" obj: "la", key: "done", value: false, overwrites: []}
```

# doc.todos[0].done = true

{op: "assign", id: "4a", obj: "1a", key: "done", value: true, overwrites: [3a]}

### MANUAL CONFLICT RESOLUTION

doc. todos[0]. deadline = "2021-07-14" merge

## doc.todos[0]. deadline = "2021-07-10"

```
{op: "assign", id: "5a", obj: "la", key: "deadline", value: "2021-07-10", overwrites: []}
```

### doc.todos[0]. deadline = "2021-07-14"

```
{op: "assign", id: "56", obj: "la", key: "deadline", value: "2021-07-14", overwrites: []}
```

## doc.todos[0]. deadline = "2021-07-10"

```
{op: "assign", id: "5a", obj: "1a", key: "deadline", value: "2021-07-10", overwrites: []}
```

### doc.todos[0]. deadline = "2021-07-14"

#### MANUAL CONFLICT RESOLUTION

merge

doc. todos[0]. deadline = "2021-07-14"

```
Automerge.

getConflicts (doc.todos [0],

"deadline")

= {
5a: "2021-07-10",
5b: "2021-07-14"
}
```

## TIME TRAVEL

Automerge.get History (state)

## = TIME TRAVEL

Automerge.get History (state)

```
Echange: { message: "Add todo item", ...},
           snapshot: {todos: [{title: Buy milk", ...}, ...]}}
         { change: {message: "Mark item as done", ... },
           snapshot: {todos: [{title: "Buymilk", ...}, ...]}}
```

{op: "make Map", id: "la"}
{op: "assign", id: "2a", obj: "la", key: "title", value: "Water plants", overwrites:[]}
{op: "assign", id: "3a", obj: "la", key: "done", value: false, overwrites: []}
{op: "assign", id: "4a", obj: "la", key: "done", value: true, overwrites: ["3a"]}

Eop: "make Map", id: "la"} {op: "assign", id: "2a", obj: "la", key: "title", value: "Water plants", overwrites:[]} ξορ: "assign", id: "3a", obj: "la", key: "done", value: false, overwrites: []} {op: "assign", id: "4a", obj: "la", key: "done", value: true, overwrites: ["3a"]} convert into table of ops id obi key value

op	id	obj	key	value	overwritten by
makeMap	la	root	todo		<b>{</b> }
assign			done	false	{4a}
assign		1600	done	1	<i>{}</i>
assign	2a	la	title	"Water plants"	<b>{</b> }
		<i>2</i> 2.	il map: lexico	paraphic by key	

Sort order: 1. by object 10

ОР	id	obj	key	value	overwritten by
make Map	la	root	todo		33
assign			done	false	{4a}
assign			done		<i>{}</i>
assign	2a	la	title	"Water plants"	<b>{}</b>

op	id	obj	key	value	overwritten by
make Map	la	root	todo		<b>{}</b>
assign			done	false	{4a}
assign			done		<i>{}</i>
assign	2a	la	title	"Water plants"	<b>{}</b>

Visibility rule: operation with  $ID = (ctr_{10}, node_{10})$  and overwritten  $By = \{(ctr_{10}, node_{1}), (ctr_{2}, node_{2}), \dots\}$  is visible at document version V iff  $ctr_{10} \leq V[node_{10}]$  and

\$ (ctri, node;) & overwritten By. ctri = V [node;].

Visibility rule: operation with  $ID = (ctr_{10}, node_{10})$  and overwritten  $By = \{(ctr_{10}, node_{1}), (ctr_{2}, node_{2}), \dots\}$  is visible at document version V iff  $ctr_{10} \leq V[node_{10}]$  and

\$ (ctri, node;) & overwrittenBy. ctr; \le V [node;].

Like MVCC in databases with snapshot isolation!

Visibility rule: operation with  $ID = (ctr_{10}, node_{10})$  and overwritten  $By = \{(ctr_{10}, node_{1}), (ctr_{2}, node_{2}), \dots\}$  is visible at document version V iff  $ctr_{10} \leq V[node_{10}]$  and

\$\(\(\tau\_{i}, node\_i\) \(\in\) e overwritten By. ctr; \(\in\) [node;].

Like MVCC in databases with snapshot isolation!

For a given key/List element:

- no ops visible => deleted
- one op visible => current value
- multiple ops visible => conflict (concurrent assignment)

operat	ion 1D	reference	element 10	inserted	character	deleted	by opID
counter	actor	counter	actor	length	WF-8	counter	actor
l	A	-	_	1	"H"	_	_
2	A	1	A	1	"e"	_	_
3	Α	2	A	1	"("	_	_
4	A	3	Α	1	"("	_	
5	A	4	A	1	"("	7	В
6	A	5	A	1	"0"	- ,	_

operati	on ID	reference	element 10	inserted	character	deleted	by op ID
counter	actor	counter	actor	length	WE-8	counter	actor
1	A	-	_	1	"H"	_	_
2	A	1	A	1	"e"	_	_
3	A	2	A	1	"("	_	_
4	A	3	Α	1	"("	_	
5	A	4	A	1	"("	7	В
6	A	5	A	1	"0"	_	
1	1 0 .					1	

J1, 2, 3, 4, 5, 6

delta-encode to 1, 1, 1, 1, 1, 1

run-length encode to (6,1)

LEB128 encodes this in 2 bytes

operation	reference element 10,		inserted	character	deleted	by op ID	
counter	actor	counter	actor	length	WE-8	counter	actor
l	A	-	_	1	"H"	_	_
2	A	1	A	1	"e"	_	_
3	A	2	A	1	"("	_	_
4	A	3	Α	1	"("	_	_
5	A	4	A	1	"("	7	В
6	A	5	A	1	"0"	-	
	1					1	

make a lookup table: {"A":0, "B": 13

 $\rightarrow$  0, 0, 0, 0, 0, 0

-> run-length encode to (6,0)

-> LEB128 encodes in 2 bytes

operation	on 10	reference e	element 10	inserted	character 1	deleted	by op D
counter	actor	counter	actor	length	UTF-8	counter	actor
l	A	_	_	1	"H"	_	_
2	A	1	A	1	"e"	_	_
3	A	2	A	1	"("	_	_
4	A	3	Α	1	"("	_	_
5	A	4	A	1	"("	7	В
6	A	5	A	1	"0"	-	_

just concatenate the UTF-8 who byte sequences -> "Hello" (6 bytes) (use length column to separate again)

operati	on ID	reference	element 10	inserted	character	deleted	by op ID
counter	actor	counter	actor	length	WE-8	counter	actor
l	A	_	_	1	"H"	_	_
2	A	1	A	1	"e"	_	_
3	A	2	A	1	"("	_	_
4	A	3	Α	1	"("	_	_
5	A	4	A	1	"("	7	В
6	A	5	A	1	"0"	-	
						1	

Plus some additional metadata (e.g. timestamp and range of op 1D counter values for each change)

=> can reconstruct any past document state

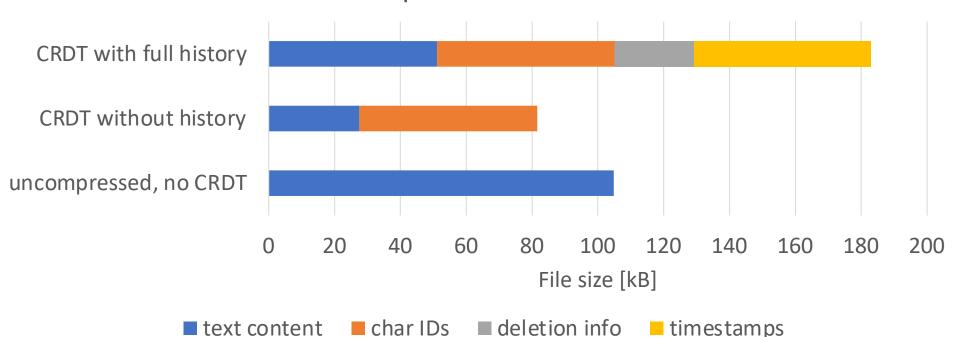
## Automerge compression benchmark

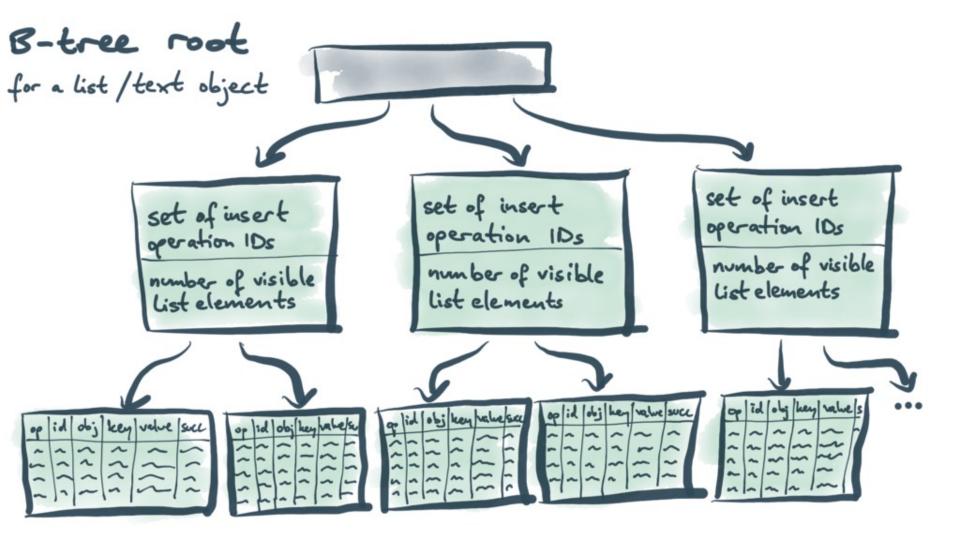
Benchmark data: keystroke-by-keystroke editing trace of a text file (LaTeX source of a research paper) containing 182,315 single-character insertions and 77,463 single-character deletions, timestamped with 1-second granularity.

As individual changes: 33.7 MB (130 bytes/operation)

As compressed document with full edit history: 184 kB (0.7 bytes/operation)

#### Breakdown of compressed columnar file contents





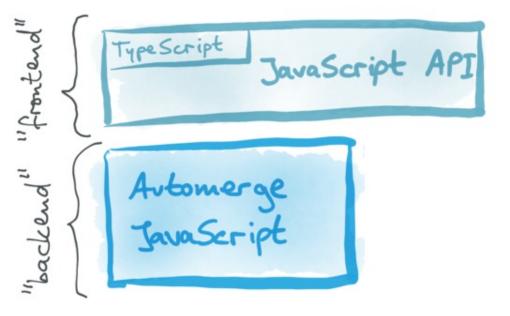
Local insert: find insertion position by index, counting only visible elements, to translate index into oplD of last insert at that index

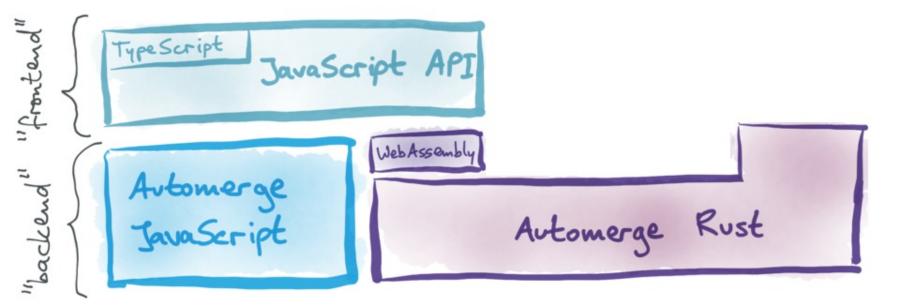
Remote insert: find subtree containing position ID, add op to B-tree, compute index of inserted element based on number of preceding visible elements

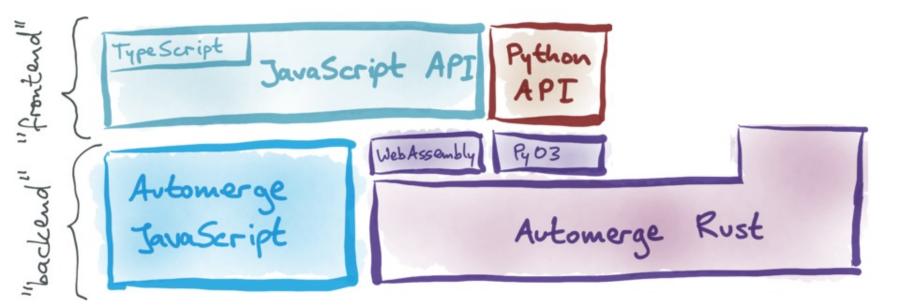
JavaScript API

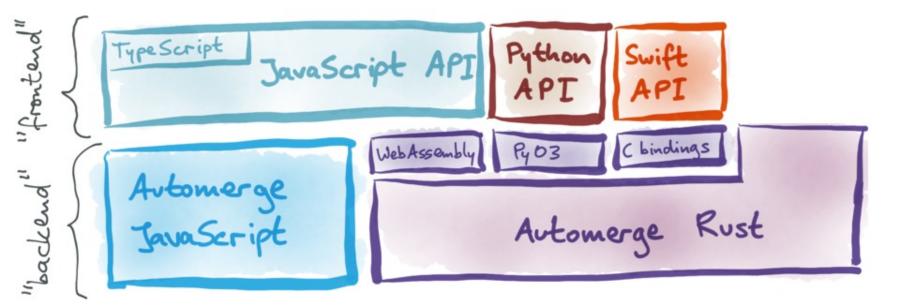
Automerge

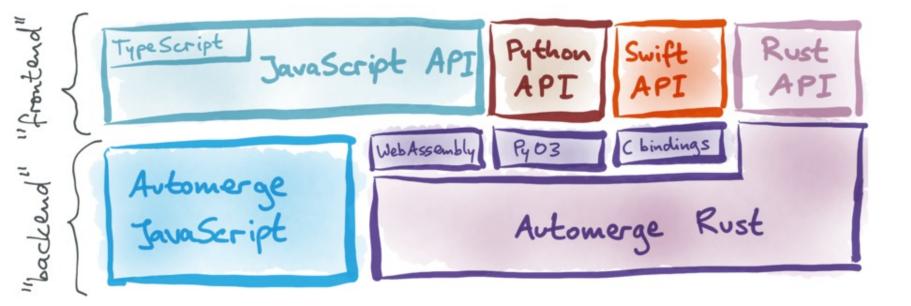
JavaScript

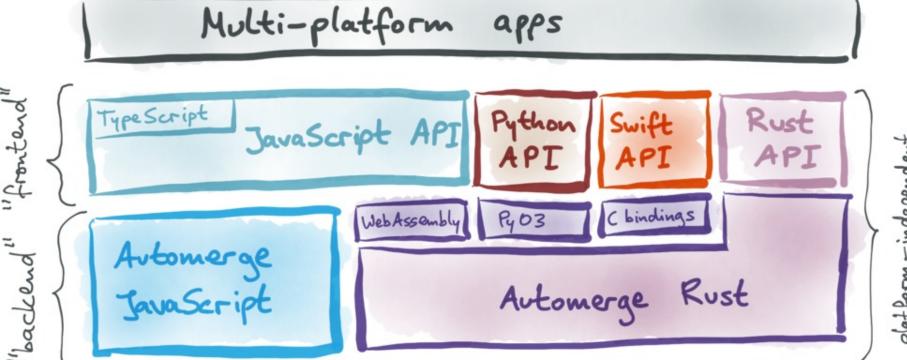




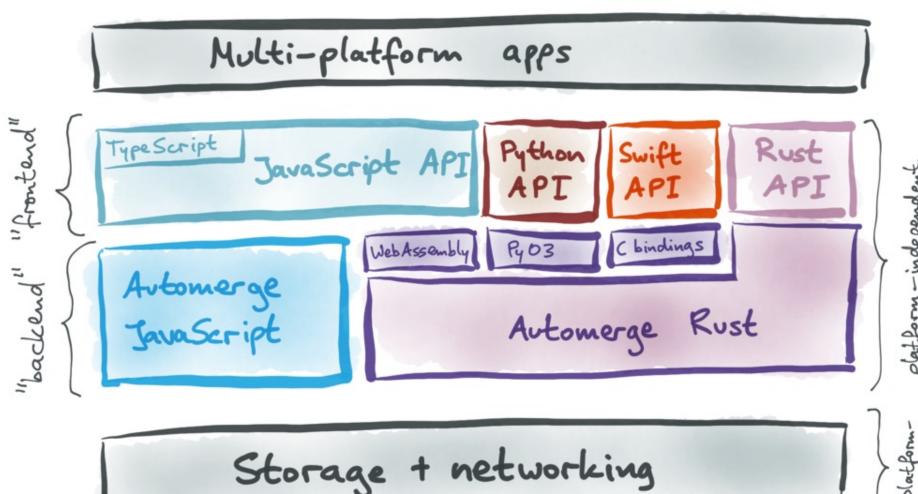








platform - independent



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#### Resources

Automerge https://automerge.org/

Publications https://martin.kleppmann.com/#publications

Email martin@kleppmann.com

Twitter @martinkl

Book http://dataintensive.net/

Support me https://www.patreon.com/martinkl

Huge thanks to my collaborators and the Automerge community and contributors, especially Peter van Hardenberg, Orion Henry, Alex Good, Andrew Jeffery, Rae McKelvey, Herb Caudill, & others!





