

Timelines @ Twitter

QCon London 2012
Arya Asemanfar

Poll-based Timeline

Tweets



Sam Pullara @sampullara

1m

@kevin0 it is mirroring -- i don't think there is a way to do as if it was a second monitor ... yet.

← In reply to kevin oliver



news.yc Popular @newsycombinator

10m

Flowers regenerated from 30,000-year-old frozen fruit tissue
j.mp/zPe7EH



The Onion @TheOnion

10m

SPORTSWIRE: Groans Abound As Tim Duncan Raises Hand Once Again At City Council Meeting onion.com/yuXGvC



news.yc Popular @newsycombinator

10m

How I built a Hacker News mobile web app j.mp/wUvRy5



Maria Popova @brainpicker


14m


YES "What we need is seriously engaged art that can teach us again that we're smart." David Foster Wallace on art vs TV j.mp/wVHItY


Poll-based Timeline


Tweets


1 new Tweet

 **Sam Pullara** @sampullara 3m
@kevin0 it is mirroring -- i don't think there is a way to do as if it was a second monitor ... yet.
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 **news.yc Popular** @newsycombinator 12m
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 **Maria Popova** @brainpicker 16m
YES "What we need is seriously engaged art that can teach us again that we're smart." David Foster Wallace on art vs TV j.mp/wVHtY

Search

Tweets [Top](#) / [All](#)

 **QCon London** @qconlondon 1h
Vote on the most important software development trends for 2012 t.co/Zaio6Rge, this will be announced in the evening keynote tonight

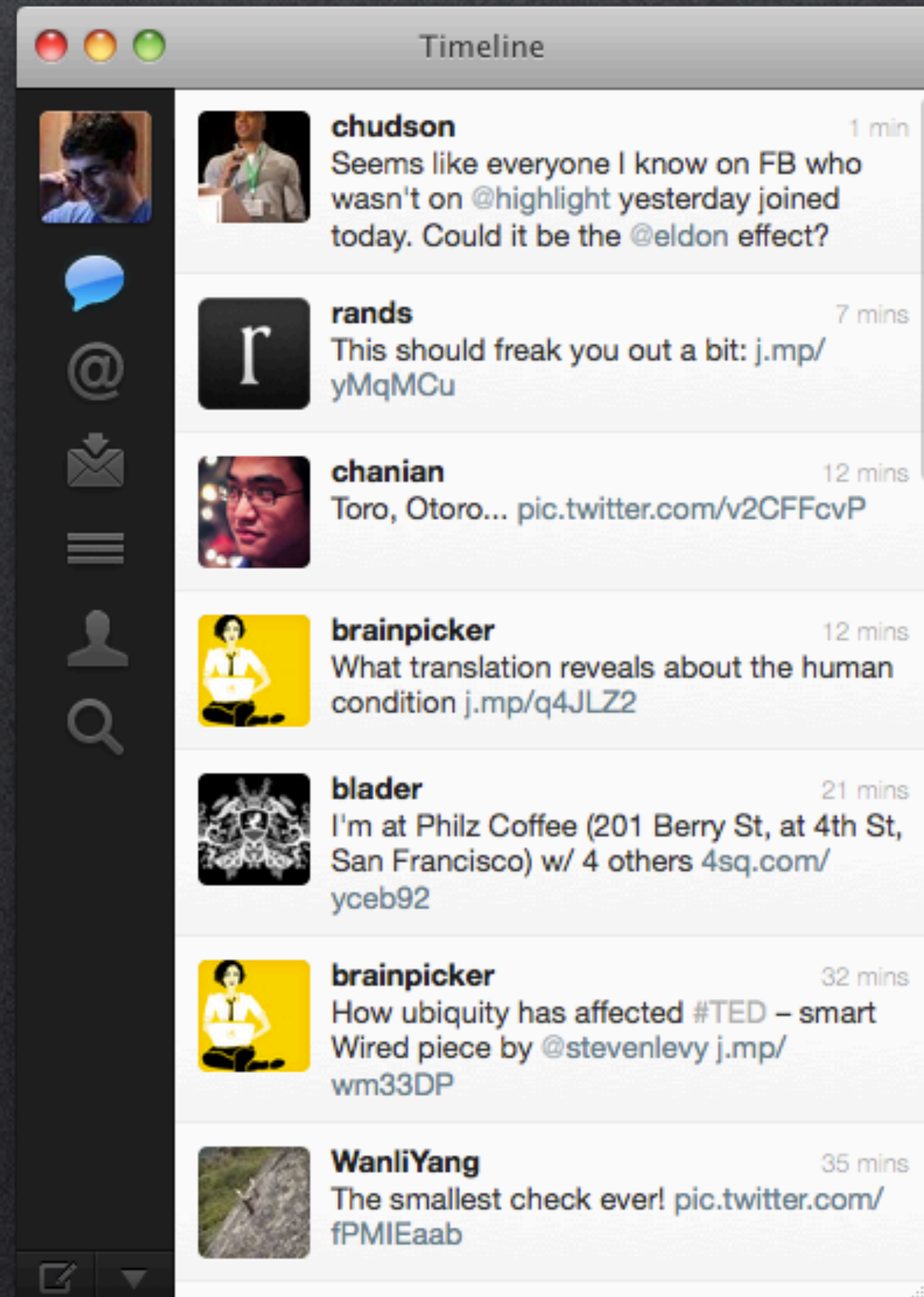
 **Open Source** @opensource_ 2h
Sold out **QCon** kicks off in **London**: big data, mobile, cloud, HTML 5
[#opensource](#) t.co/csHookQv

 **Krzysztof Wilczynski** @kwilczynski 2h
New slide from **QCon 2012** by @patrickdebois t.co/d9RbHru7
[View media](#)

 **Dušan Omerčević** @dusano 3h
[#QConLondon](#) 2012 tutorial on Continuous delivery aka. Making deployment a non-event t.co/HXYMVS6H
[View media](#)

 **Liisi Toom** @liisi 3h
QCon London is ON! ZeroTurnaround is in the house! [#fb](#)
pic.twitter.com/xLWTrDMC
[View photo](#)

Streaming (aka Push)



Timeline Delivery

100M+ active users worldwide

Poll-based

→ 200K QPS

→ latency* 1ms median, 4ms @ p99

Search

→ 30K QPS

* to determine which tweets you should see

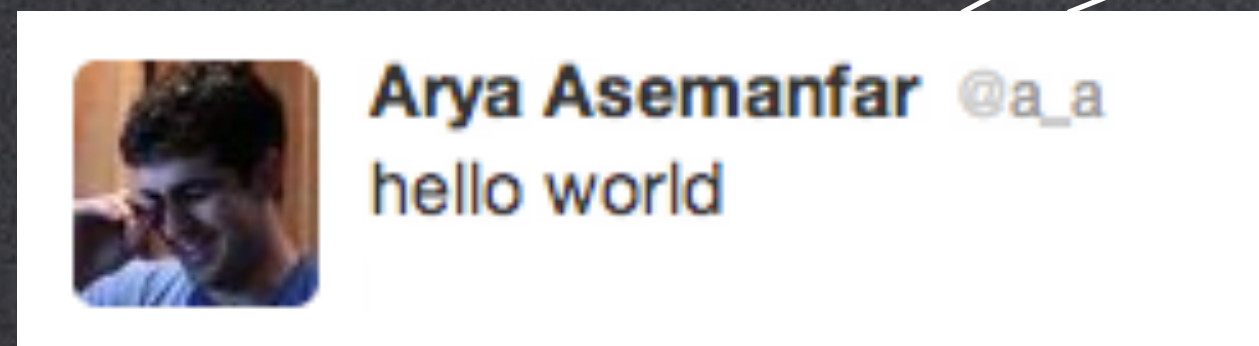
Timeline Delivery

250M New Tweets Per Day

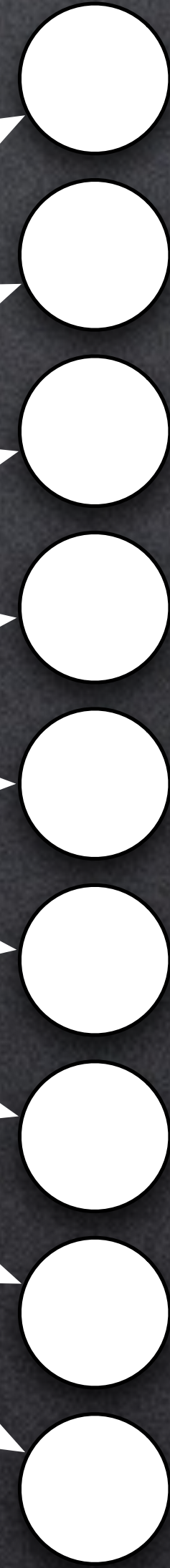
- 3K/sec - daily average
- 5k/sec - daily peak
- 10K+/sec - several large events in February

users' home timelines

new tweet



Arya Asemanfar @a_a
hello world



Timeline Delivery

26 billion deliveries every day

→ 18 million per minute

Latency to deliver to 1 million followers

→ 3.5 seconds average

→ or 285K per second

Architecture

What's happening?

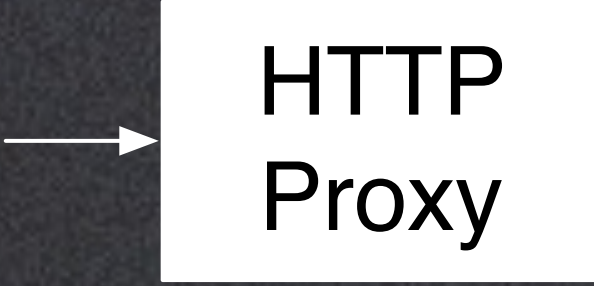


hello world|



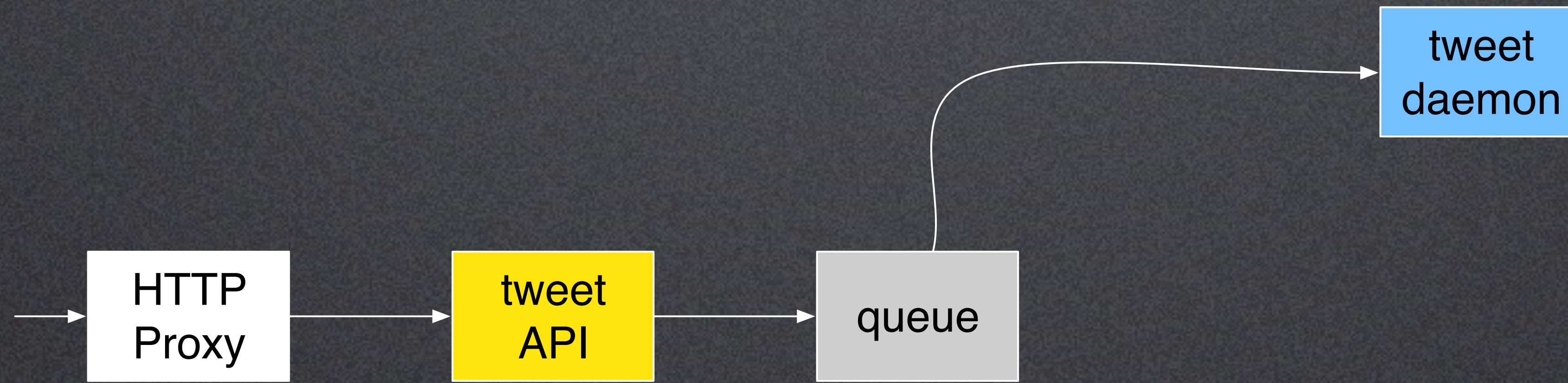
129

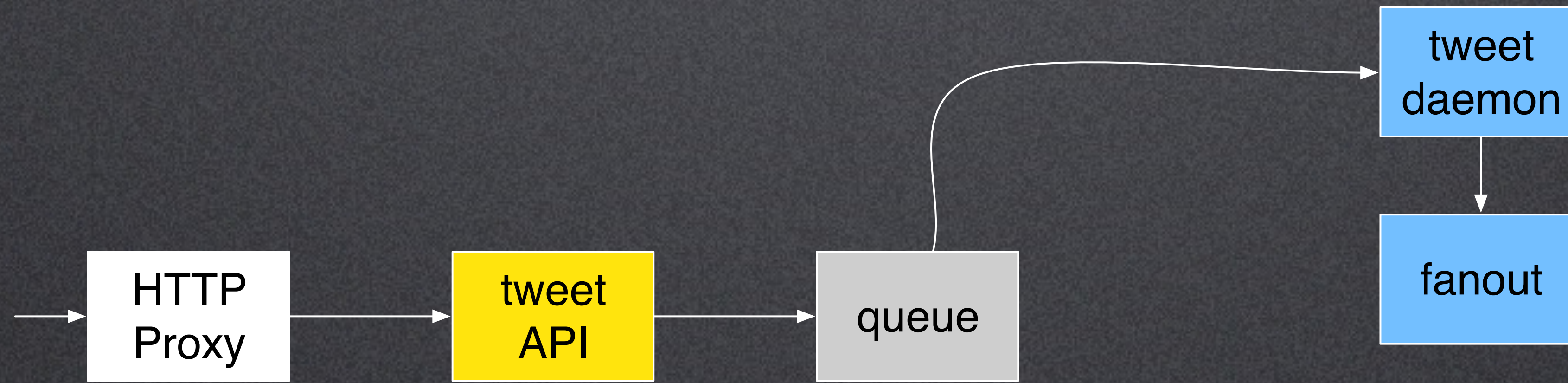
Tweet

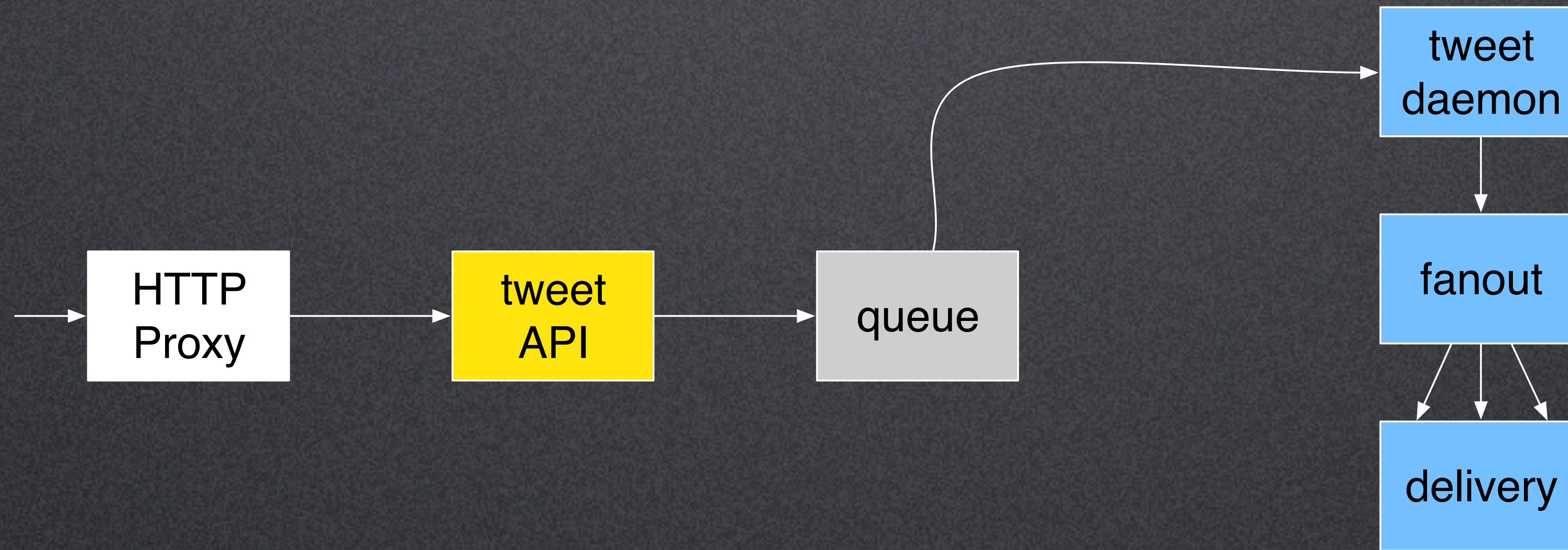








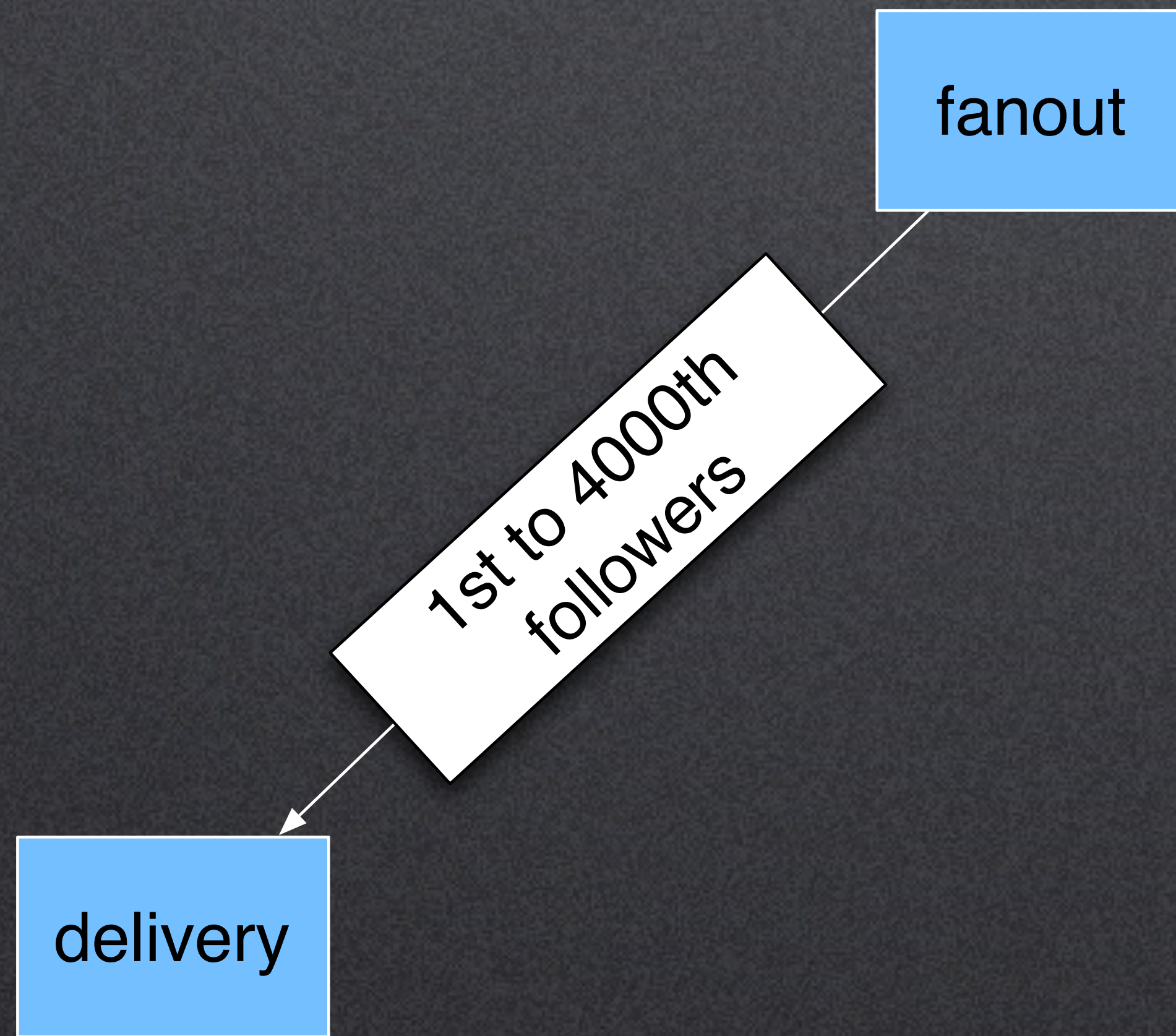




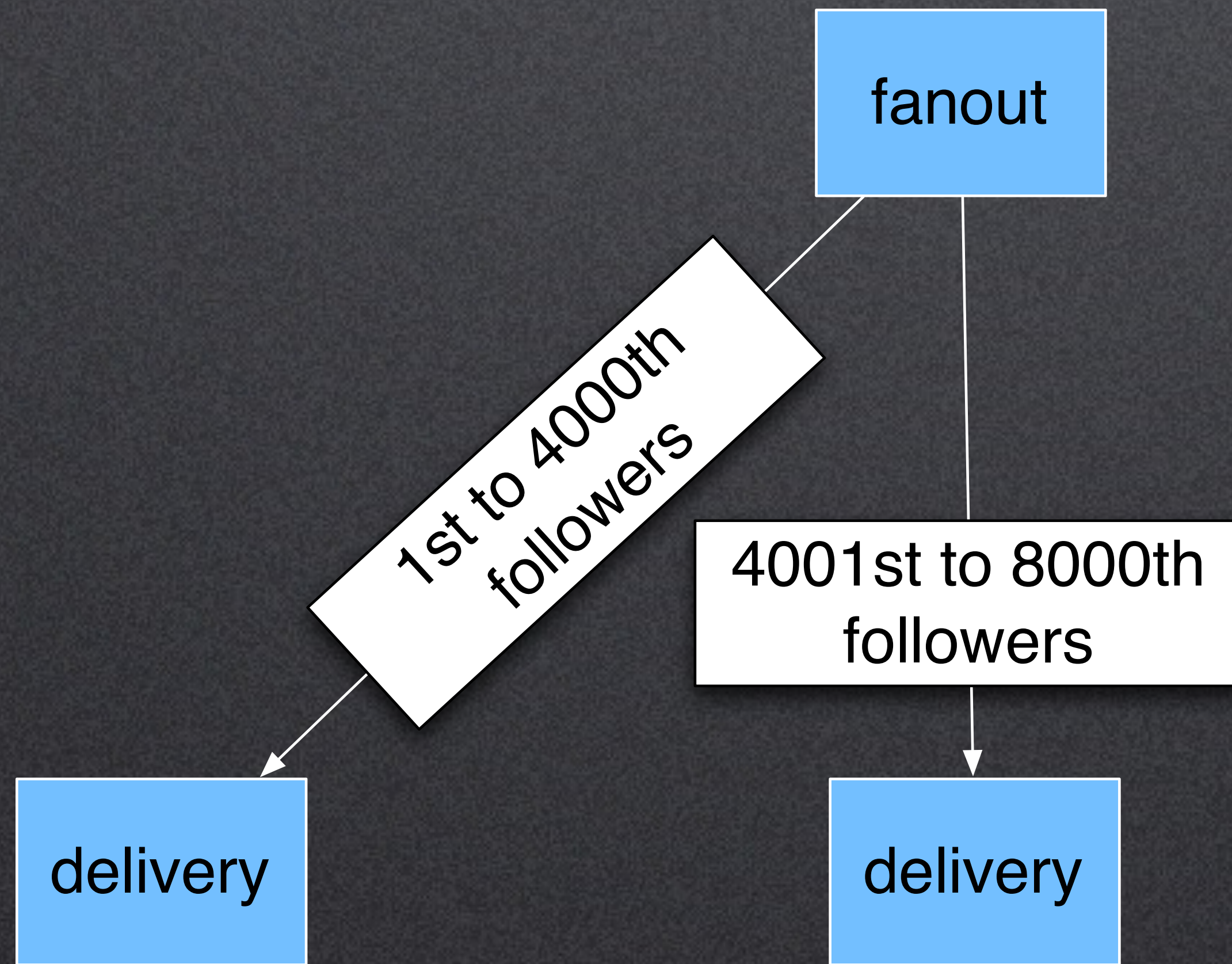
Pipelined Delivery

fanout

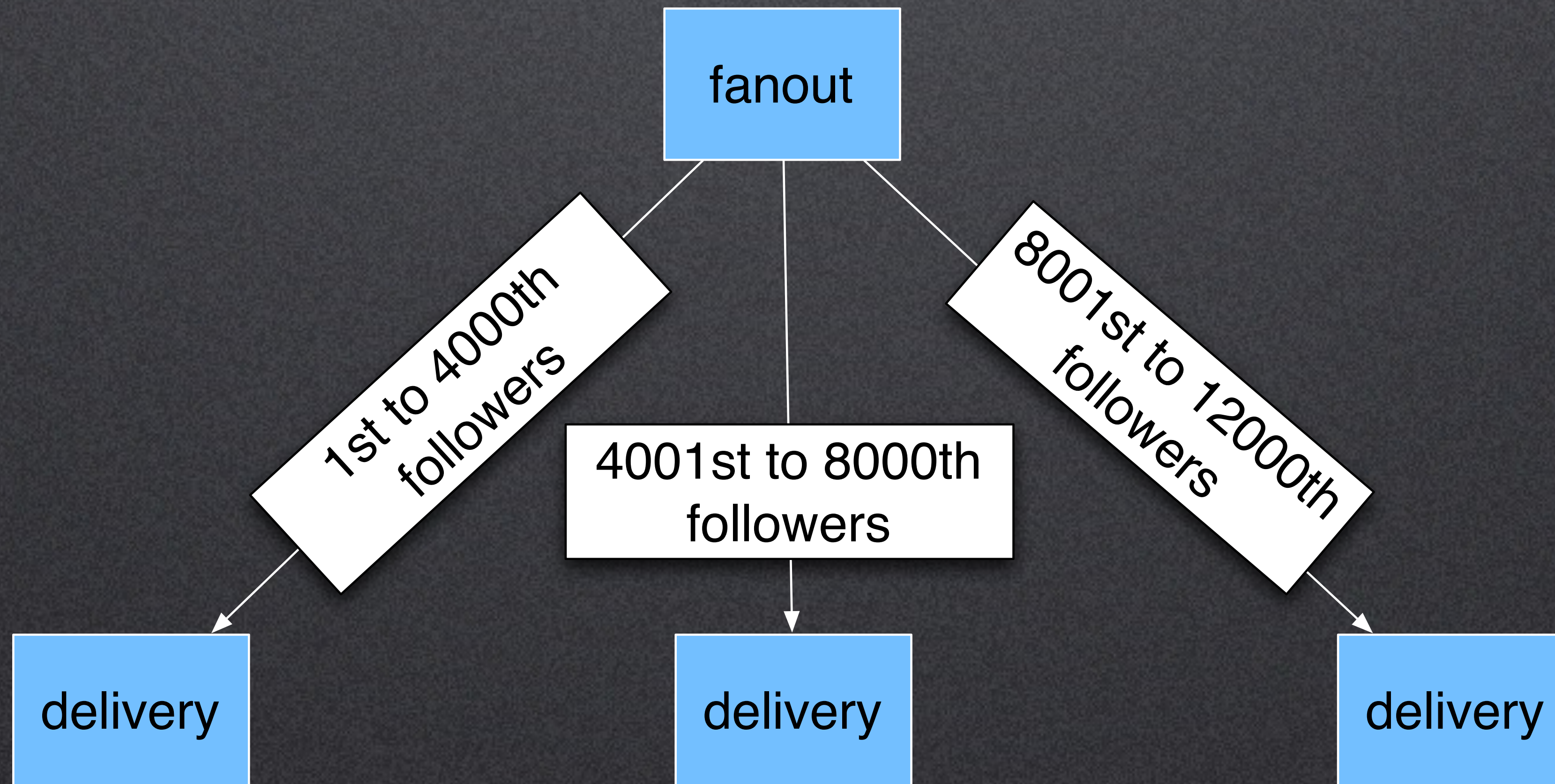
Pipelined Delivery

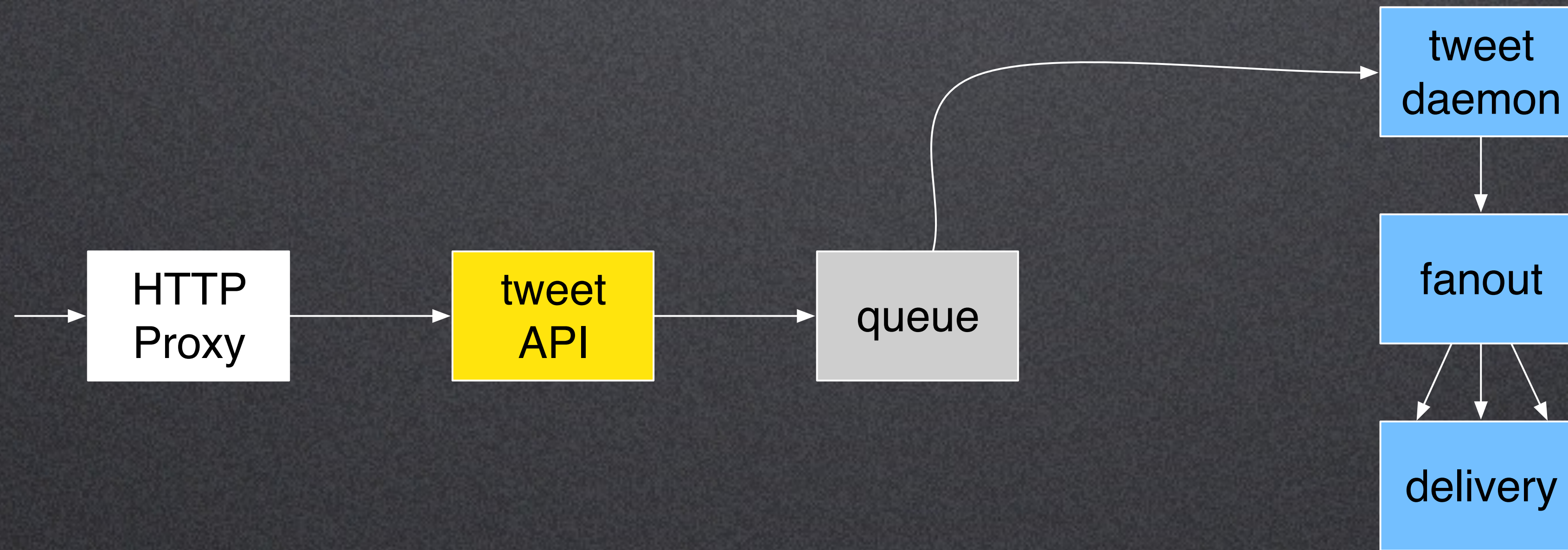


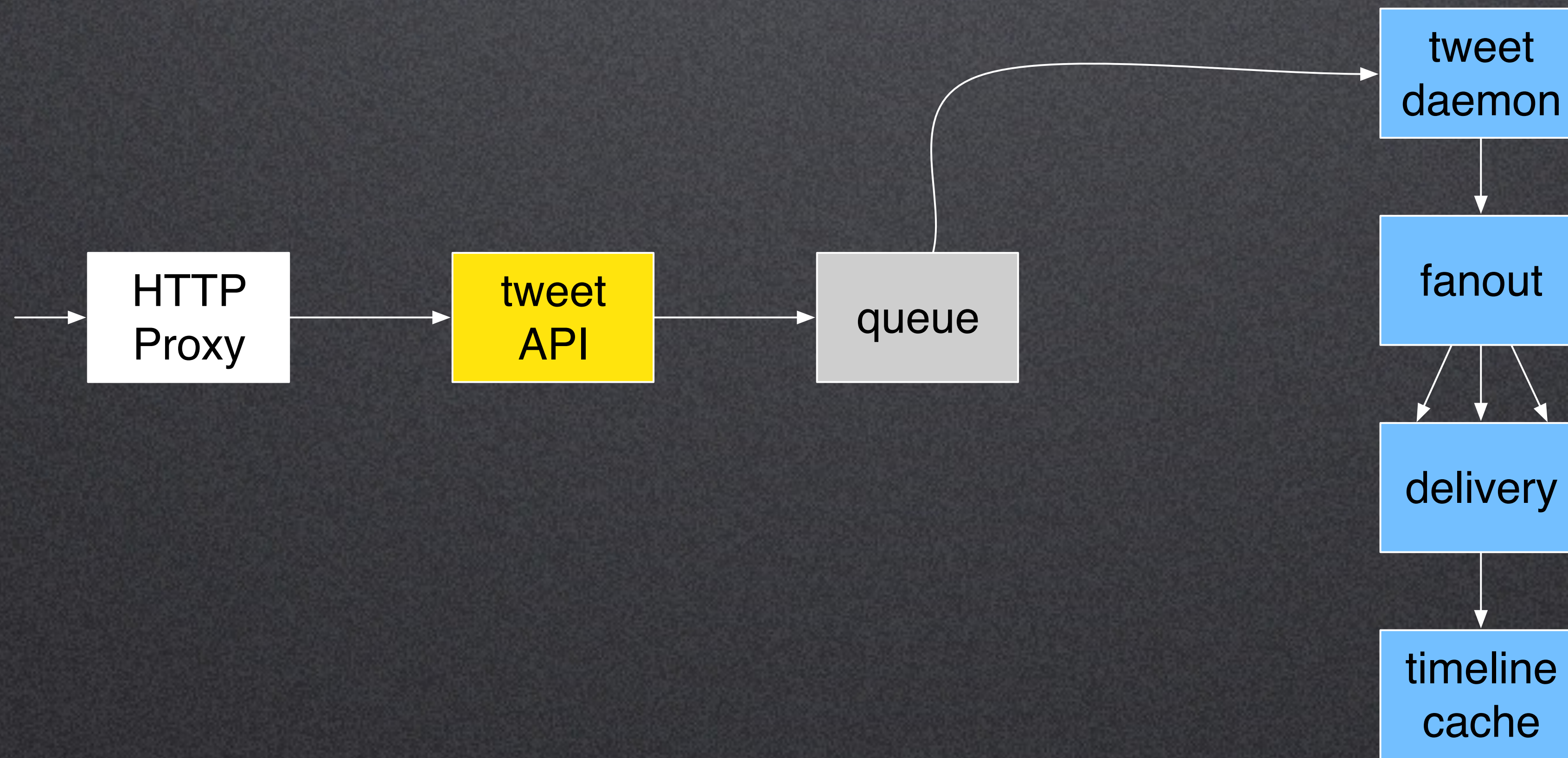
Pipelined Delivery

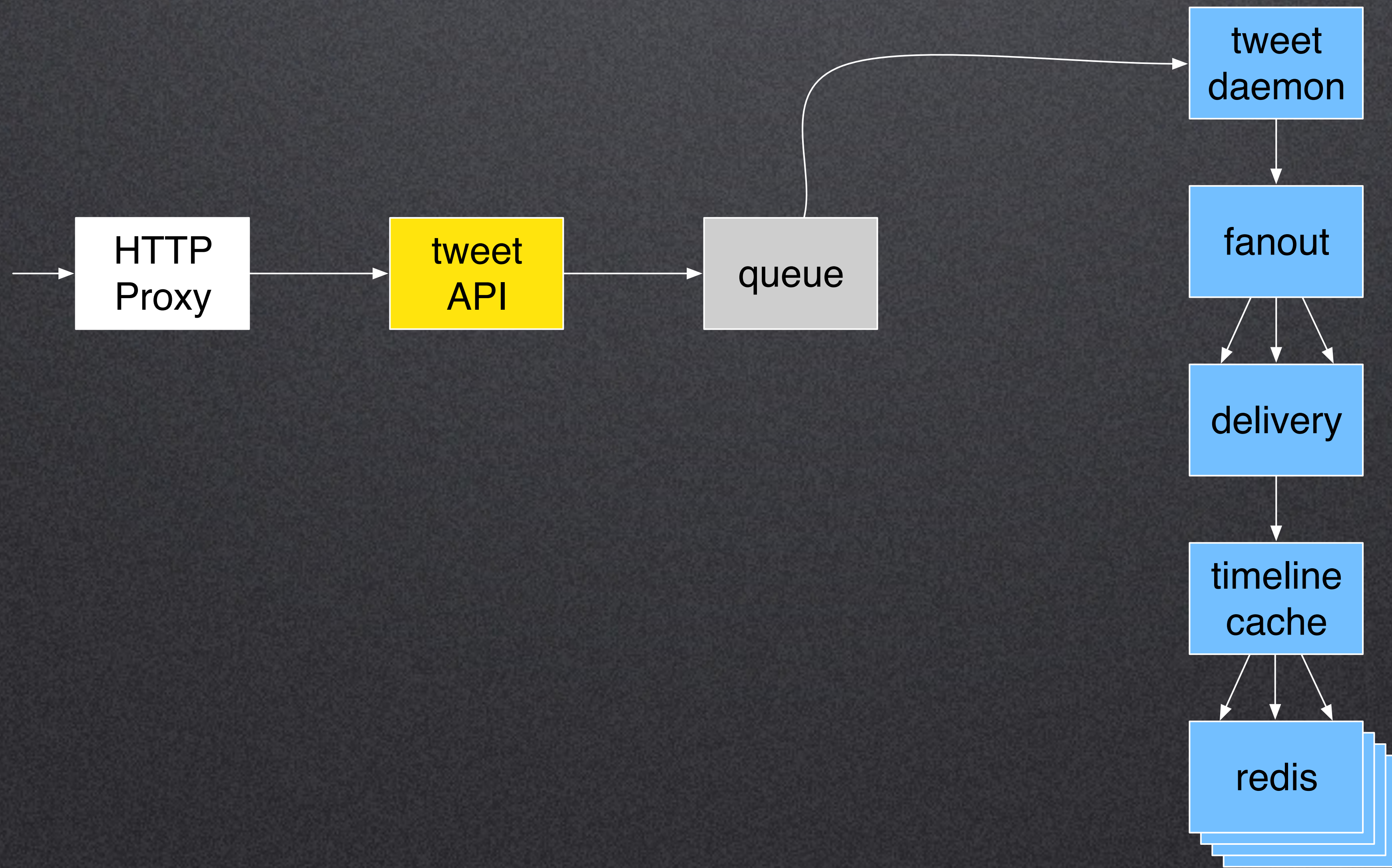


Pipelined Delivery

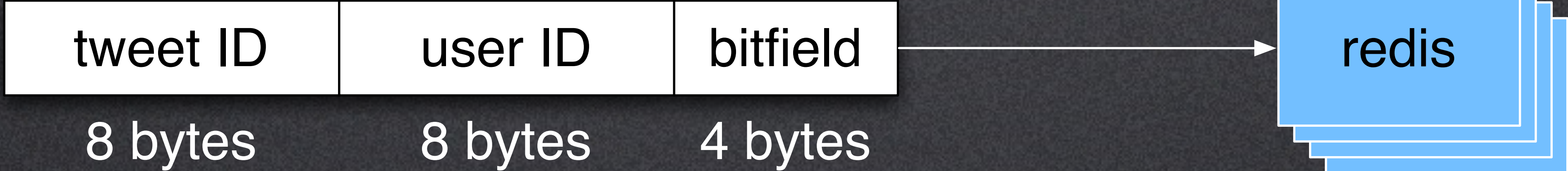








RPUSHX to timeline ID



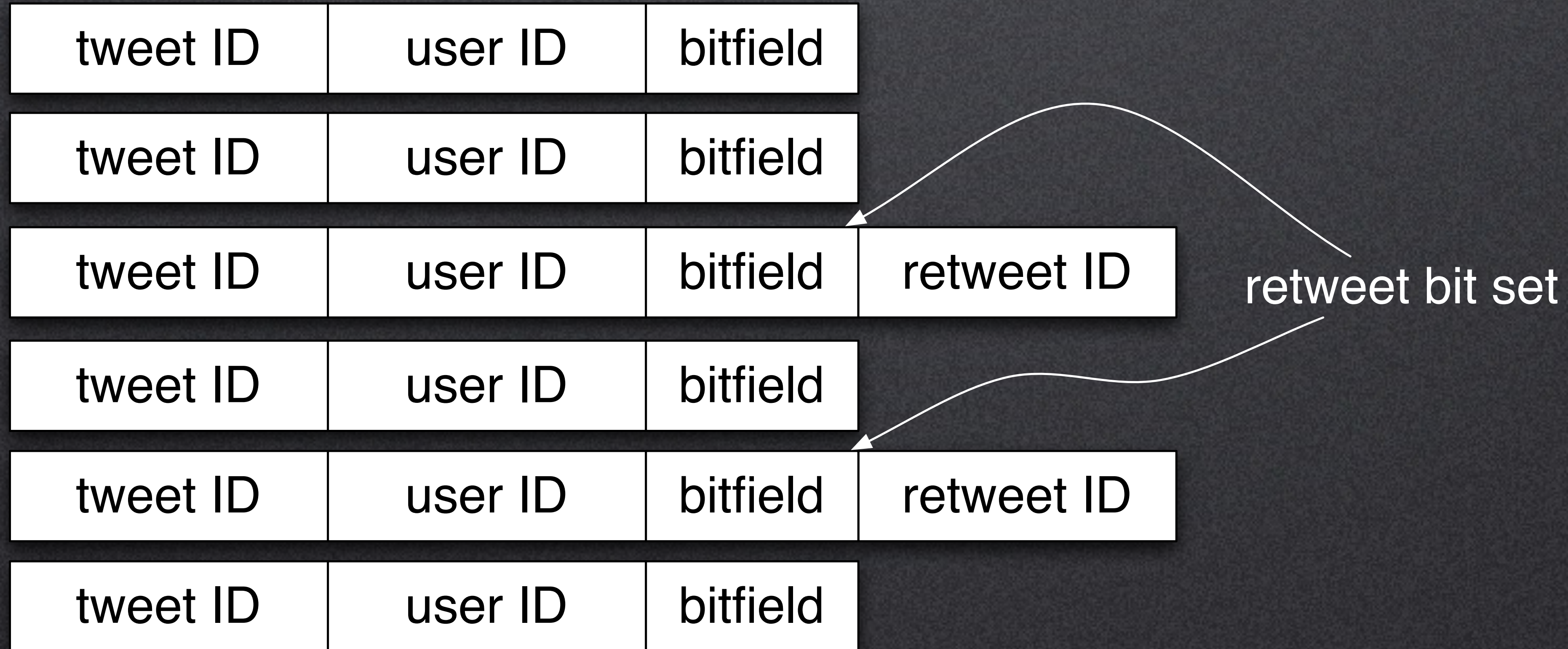
Redis list structure:

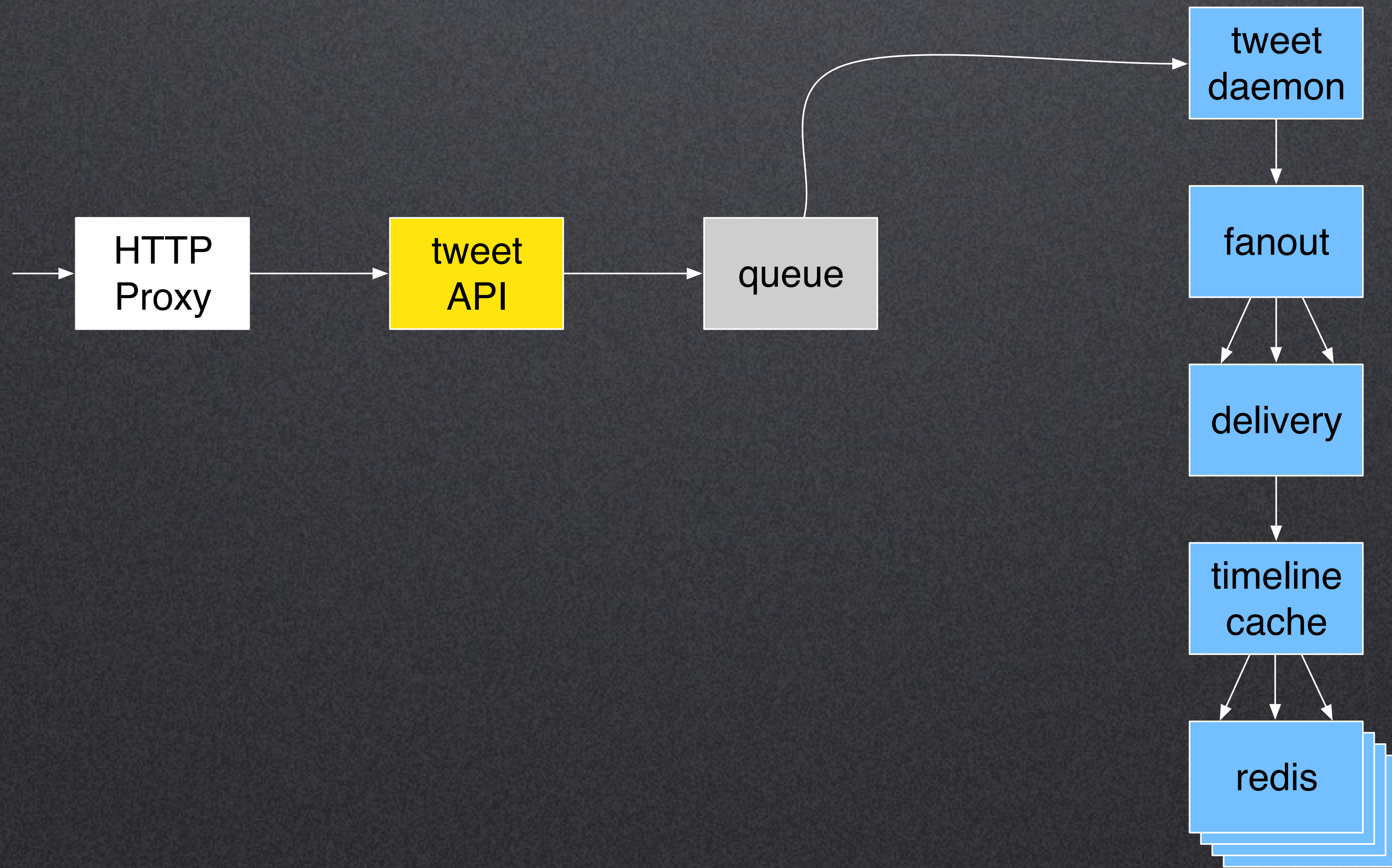
tweet ID	user ID	bitfield
tweet ID	user ID	bitfield
tweet ID	user ID	bitfield
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tweet ID	user ID	bitfield
tweet ID	user ID	bitfield

Redis list structure:

tweet ID	user ID	bitfield	
tweet ID	user ID	bitfield	
tweet ID	user ID	bitfield	retweet ID
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tweet ID	user ID	bitfield	retweet ID
tweet ID	user ID	bitfield	

Redis list structure:





Poll-based Timelines

Tweets

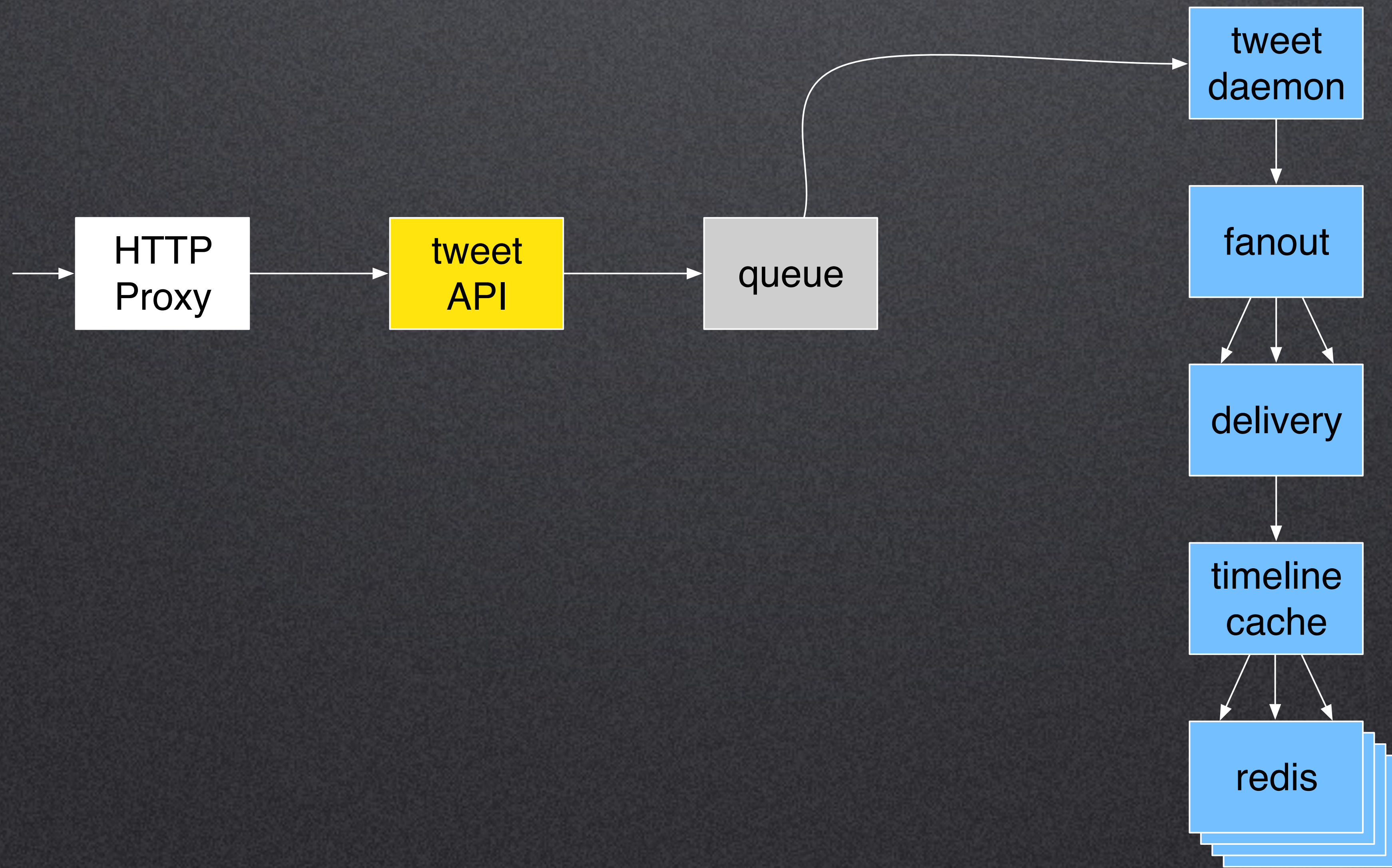
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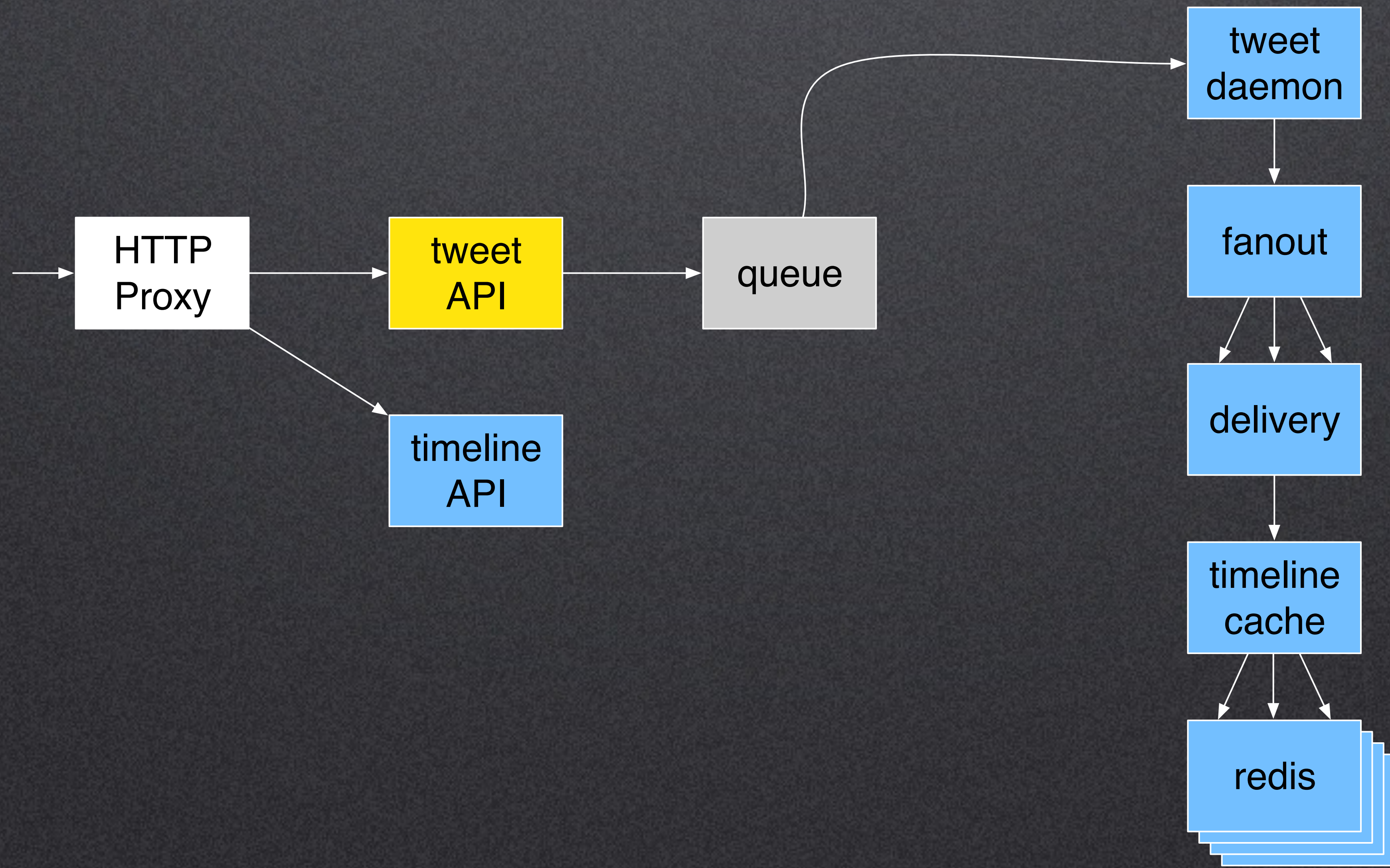
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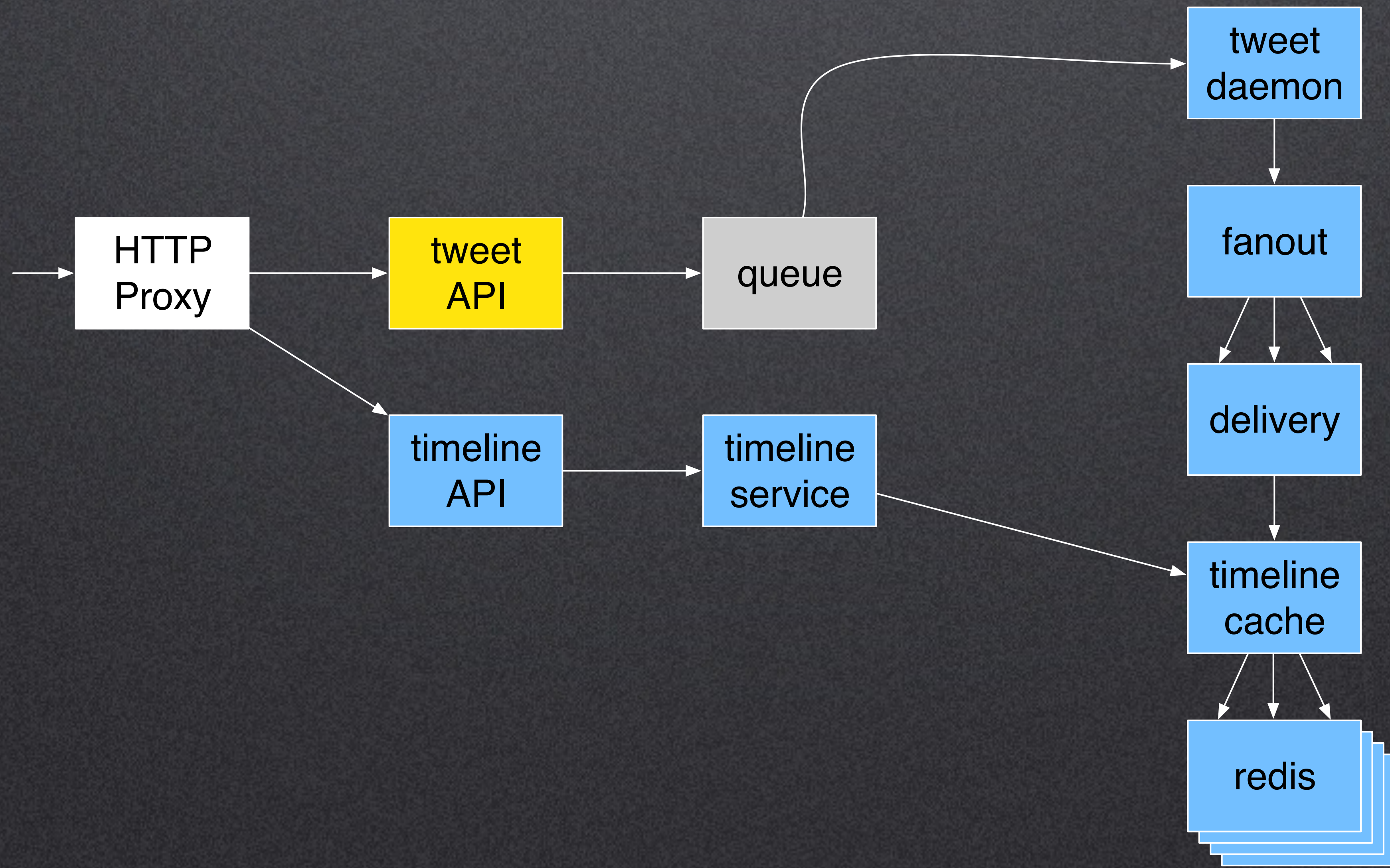
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Loading your home timeline

three pieces of data

----> **timeline**

----> tweets

----> users



The screenshot displays a vertical list of five tweets. Each tweet includes a profile picture, the user's name and handle, the tweet text, and a timestamp. The first tweet is from Maria Popova (@brainpicker) posted 37m ago, mentioning Creative Commons and a video competition. The second is from Ted Nyman (@tnm) posted 1h ago, sharing a paper link and mentioning it was retweeted by Dmitriy Ryaboy. The third is from Sharon Ly (@onesnowclimber) posted 47m ago, replying to Mark McBride about a dog. The fourth is from The Onion (@TheOnion) posted 48m ago, with a link to an article. The fifth is from Game Of Thrones (@GameOfThrones) posted 48m ago, promoting a DVD/Blu-Ray release event in NYC.

Maria Popova @brainpicker 37m
Yes, please: @CreativeCommons and the Department of Education launch a video competition on why open education matters
j.mp/wa8emQ

Ted Nyman @tnm 1h
For people reading about Datomic — here's a paper from @palvaro, @neil_conway and others that you should really read:
eecs.berkeley.edu/Pubs/TechRpts/...
↕ Retweeted by Dmitriy Ryaboy

Sharon Ly @onesnowclimber 47m
@mccv @jeremycloud ouch. poor doggie!
← In reply to Mark McBride

The Onion @TheOnion 48m
Going Out To Dinner With Food-Loving Friend A Huge Ordeal
onion.com/yIYQaV

Game Of Thrones @GameOfThrones 48m
NYC: Celebrate #GameofThrones S1 DVD/Blu-Ray release & visit @BestBuy Union Square tomorrow from 4-6PM to take a photo on the Iron Throne.

Loading your home timeline

three pieces of data

→ timeline

→ tweets

→ users



The screenshot displays a Twitter home timeline with five tweets. The first tweet by Maria Popova is highlighted with a red border. The tweets are as follows:

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Loading your home timeline

three pieces of data

→ timeline

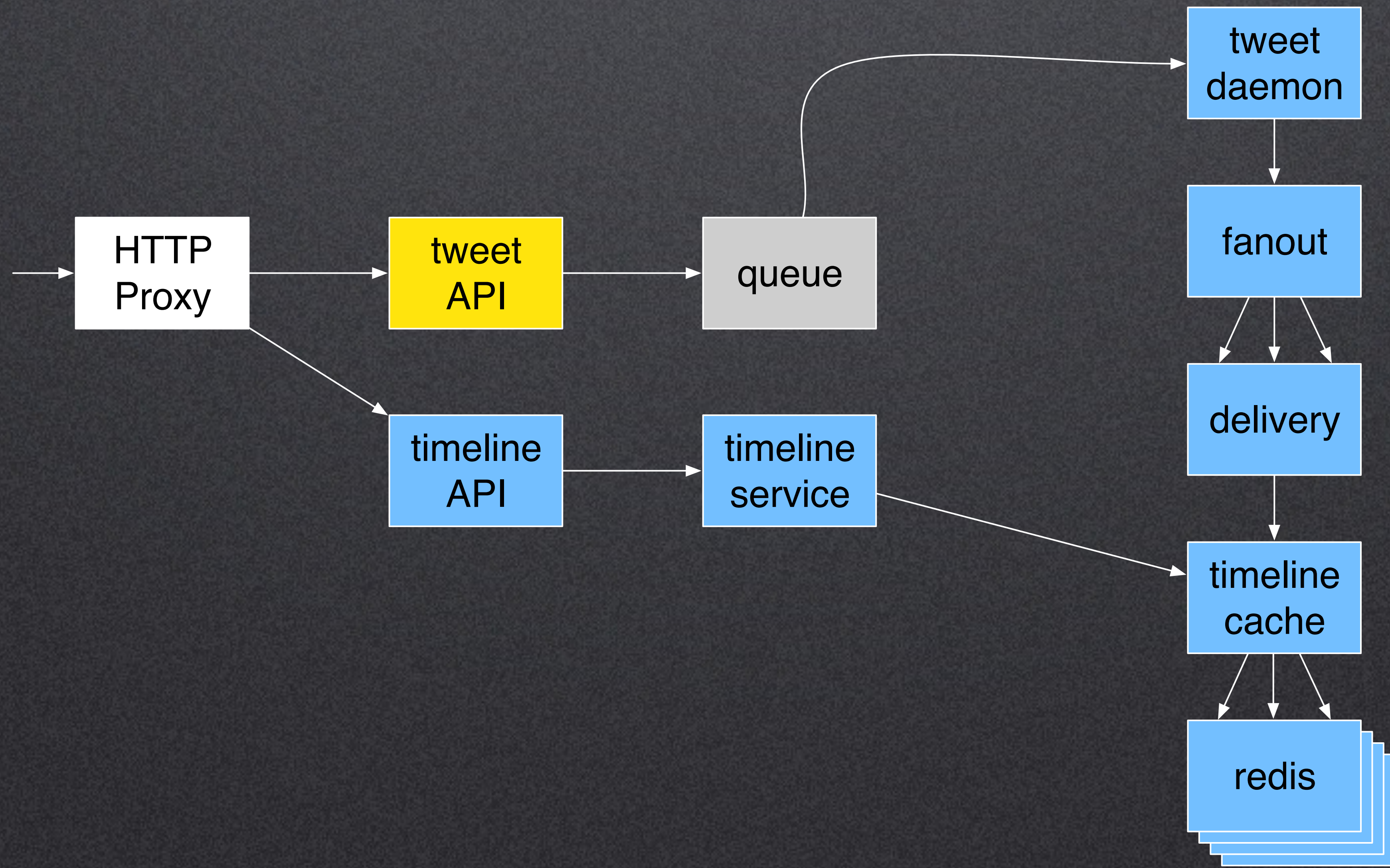
→ tweets

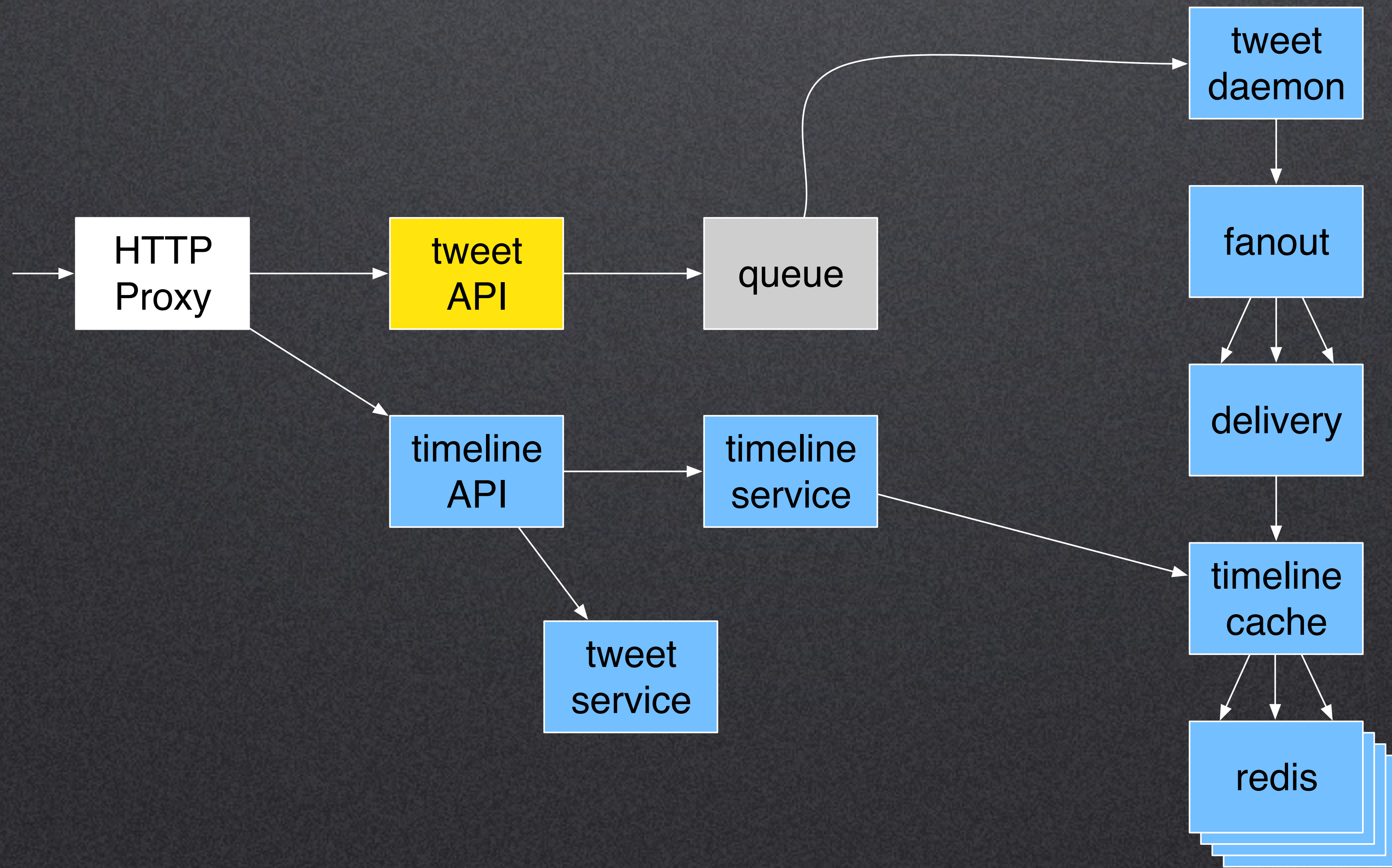
→ users

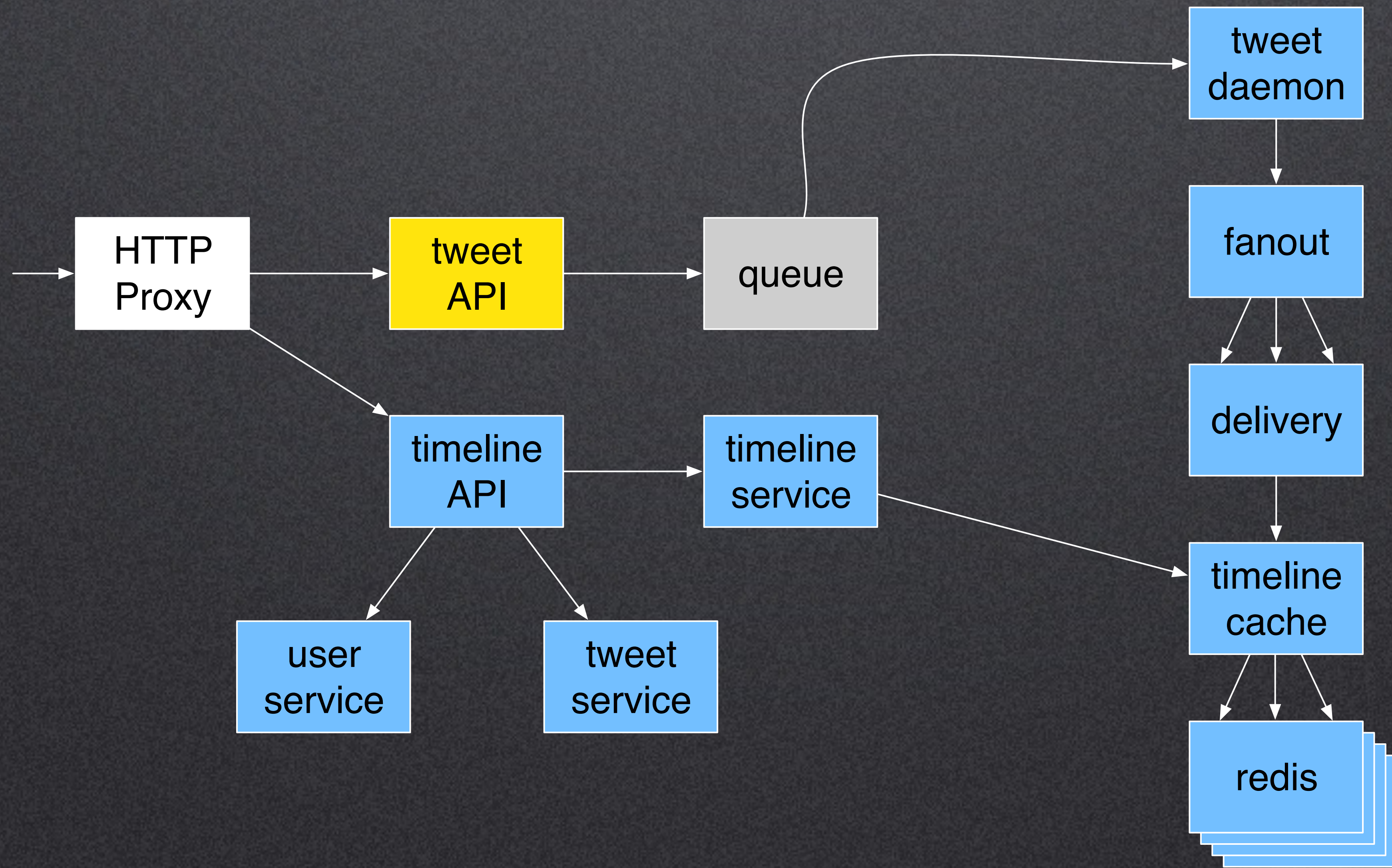


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Hot Spots

users



timelines



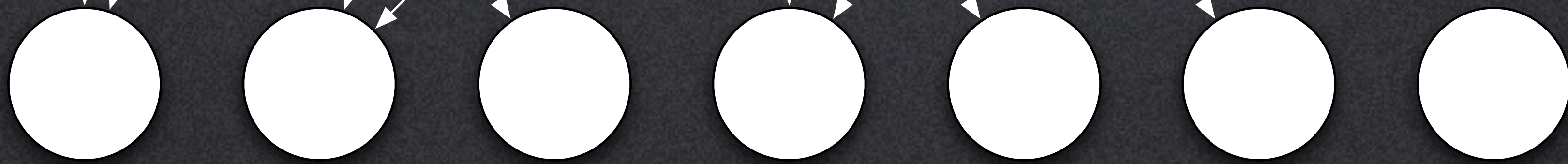
users



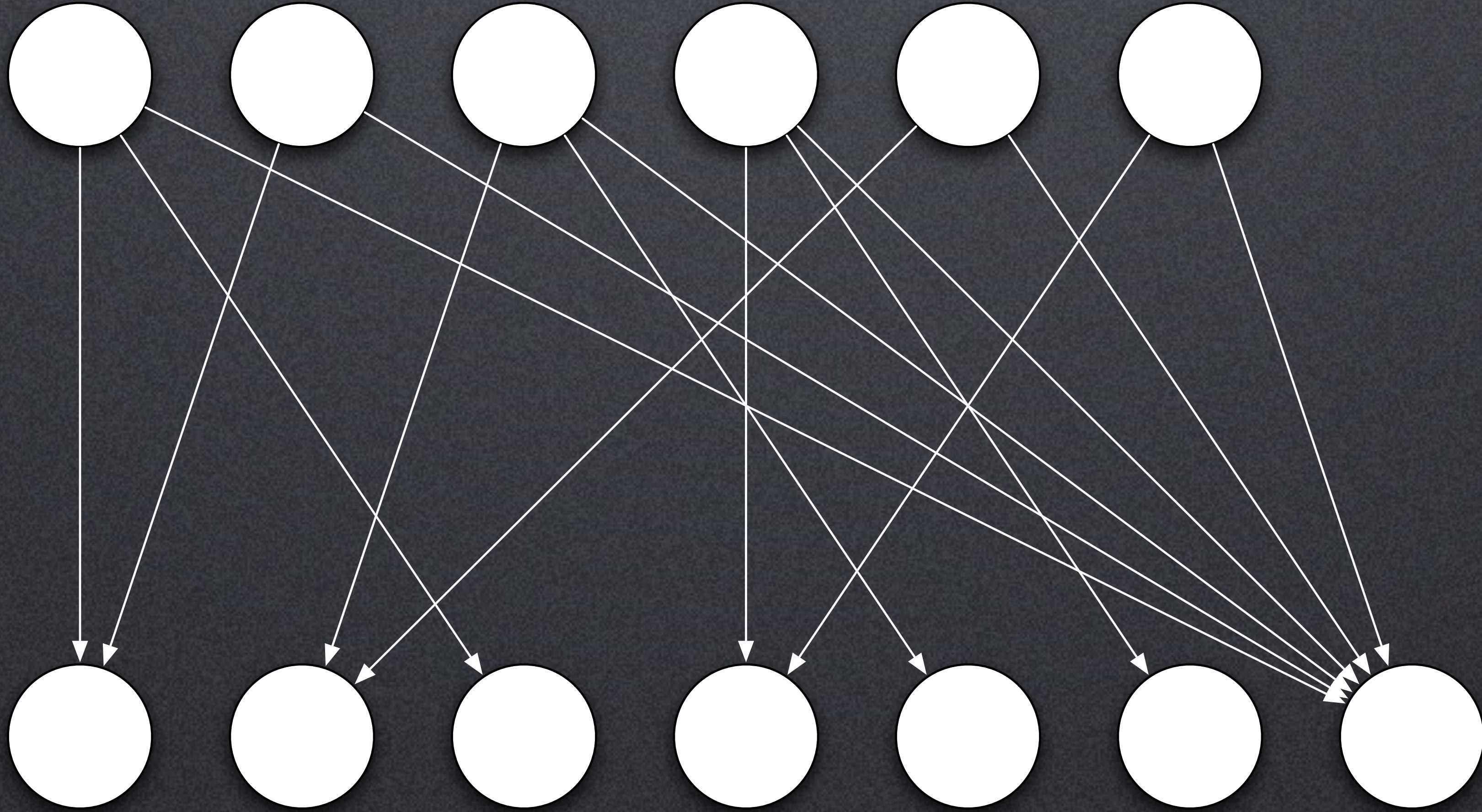
@diarioas
timeline



timelines

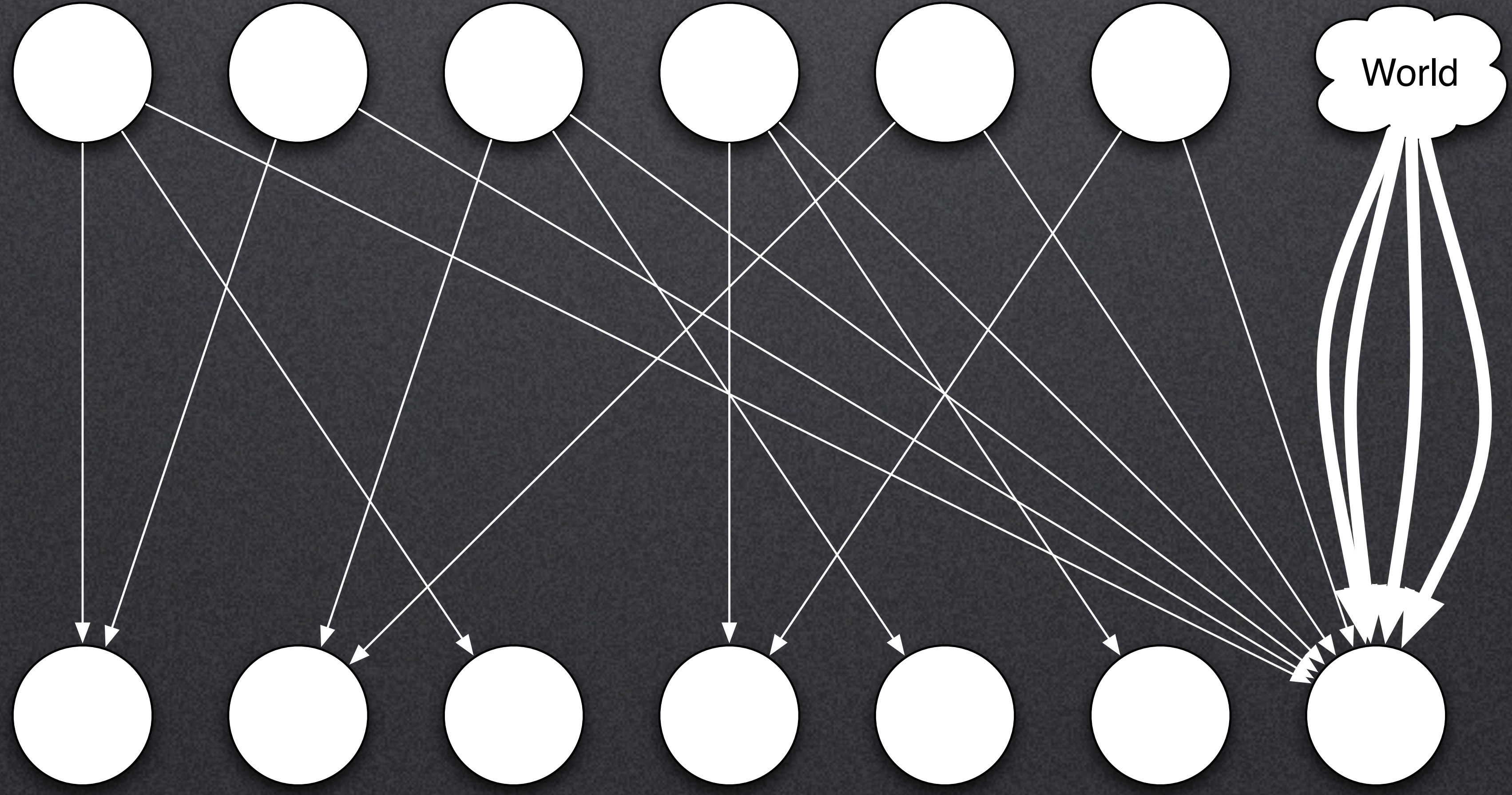


users



timelines

users



timelines

large sustained QPS
for a single timeline



timeline
service

timeline
service

timeline
service

timeline
service

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timeline
service

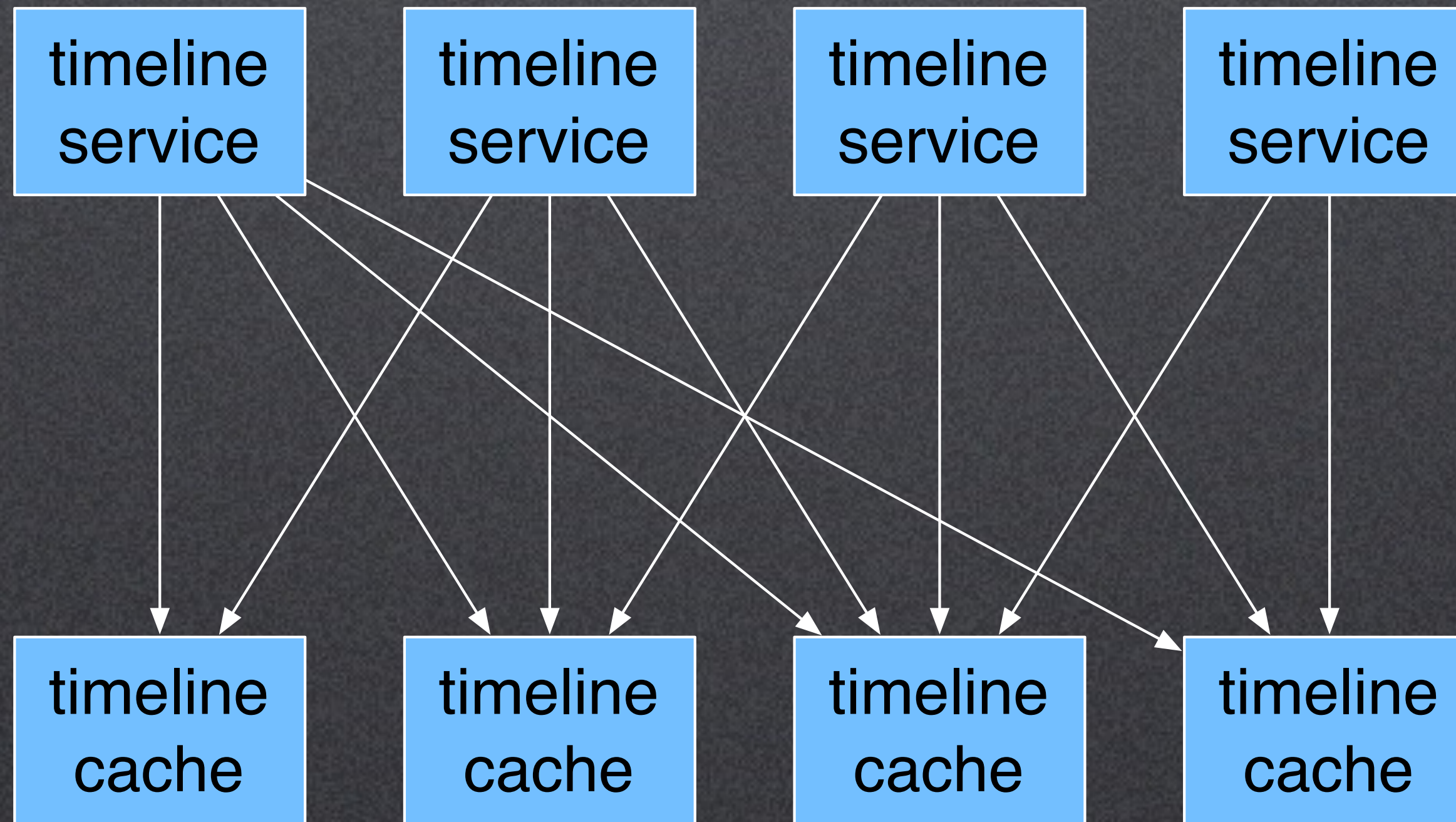
timeline
service

timeline
cache

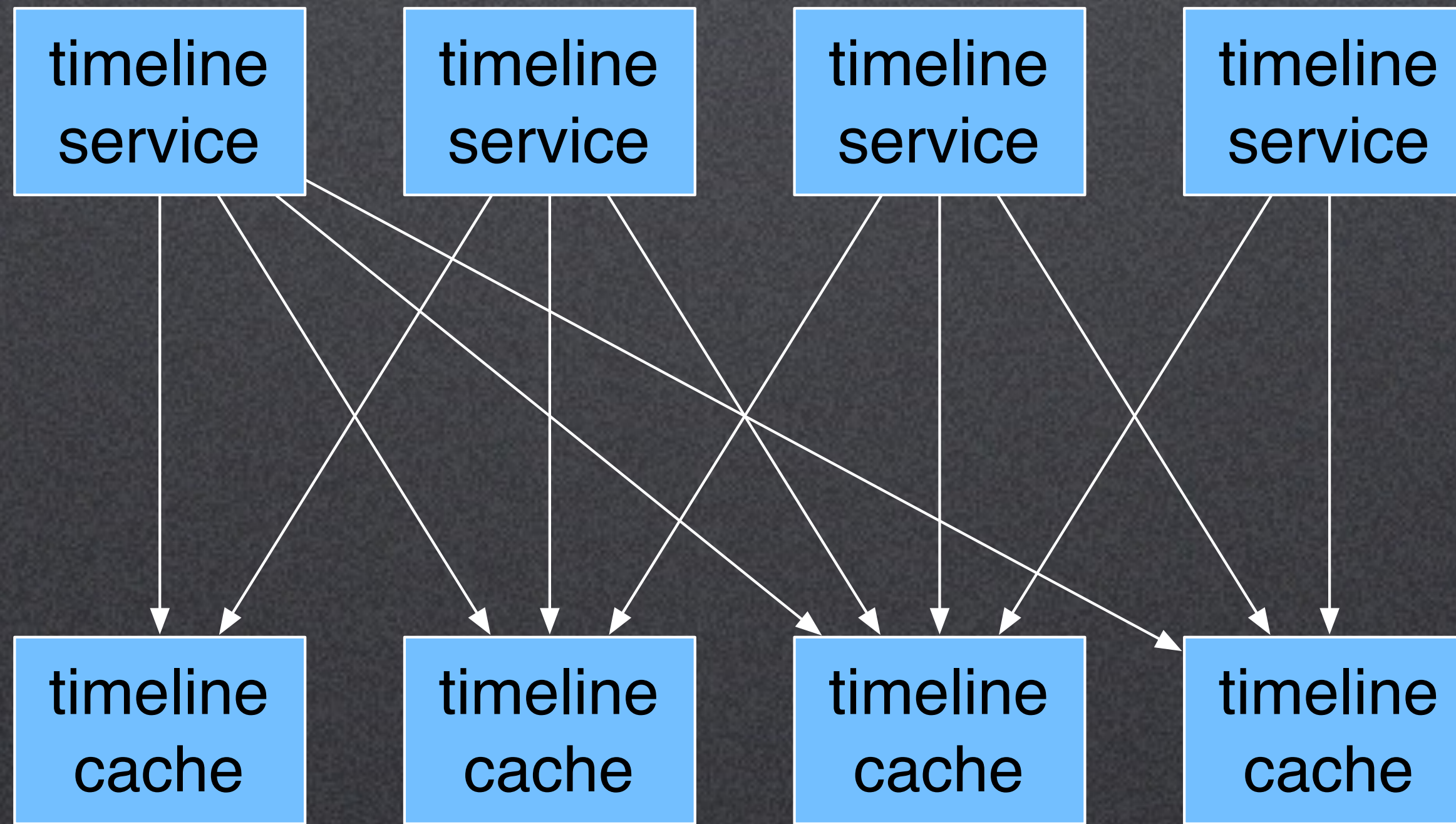
timeline
cache

timeline
cache

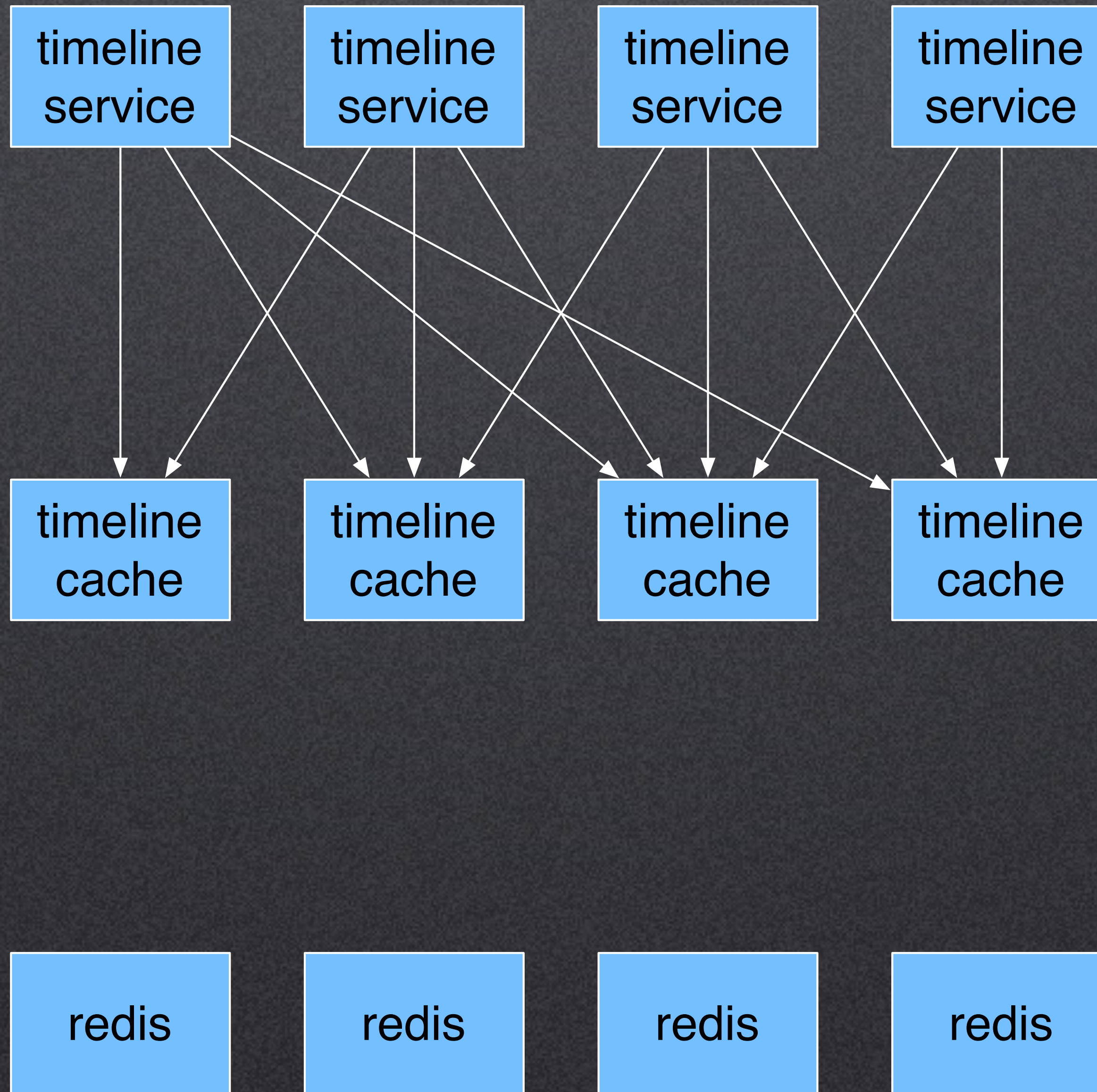
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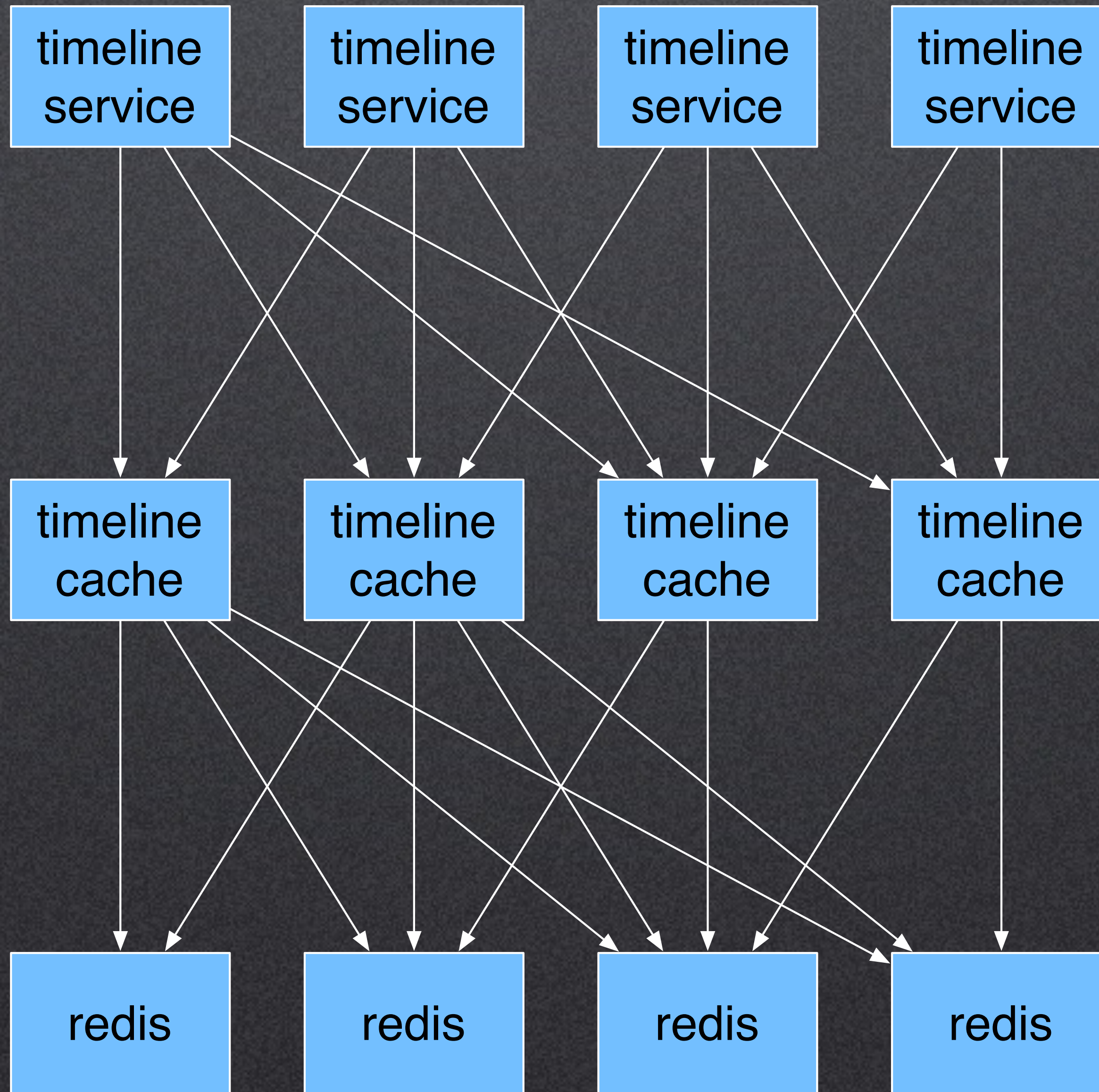


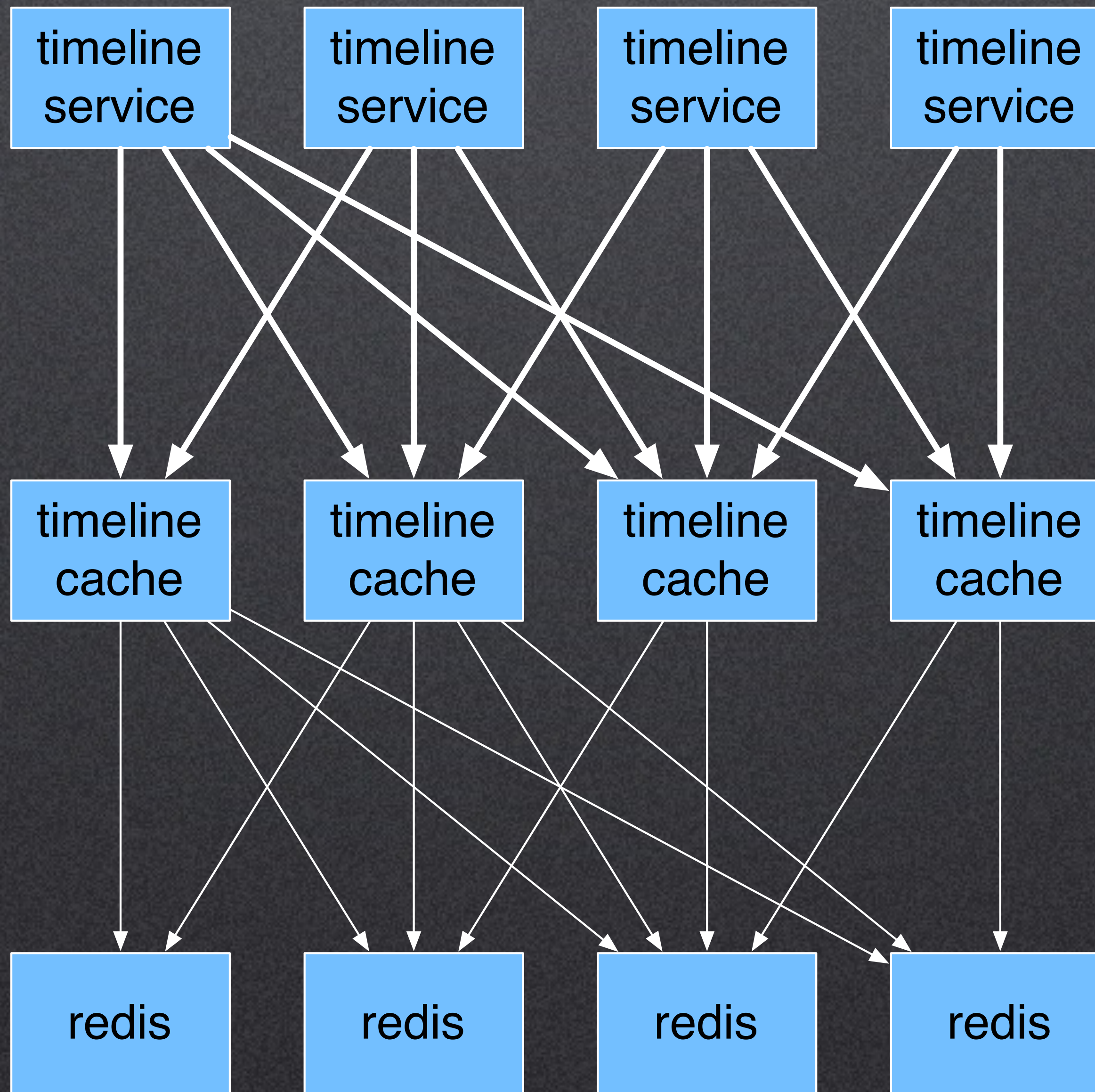
partitioning
layer

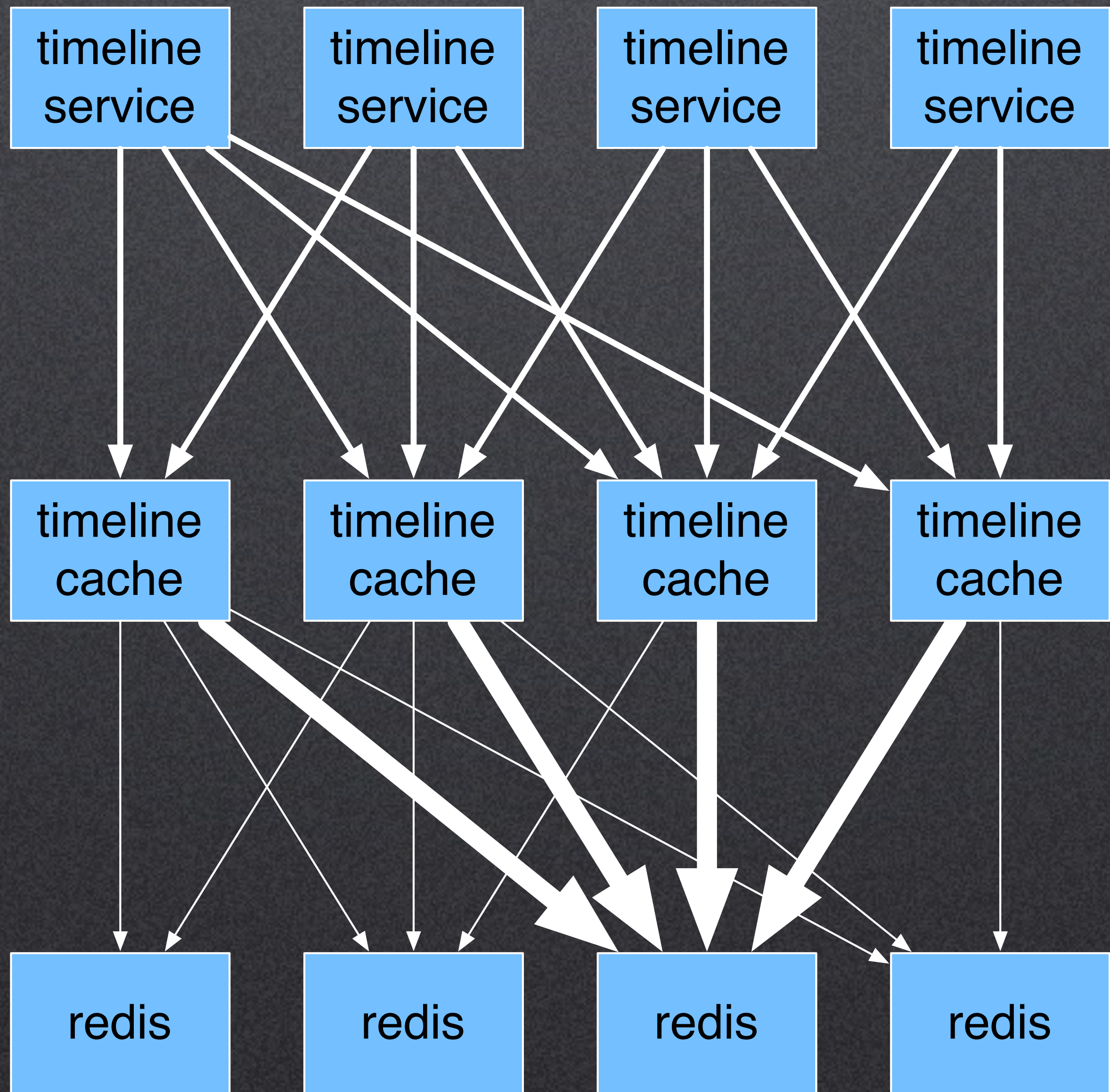


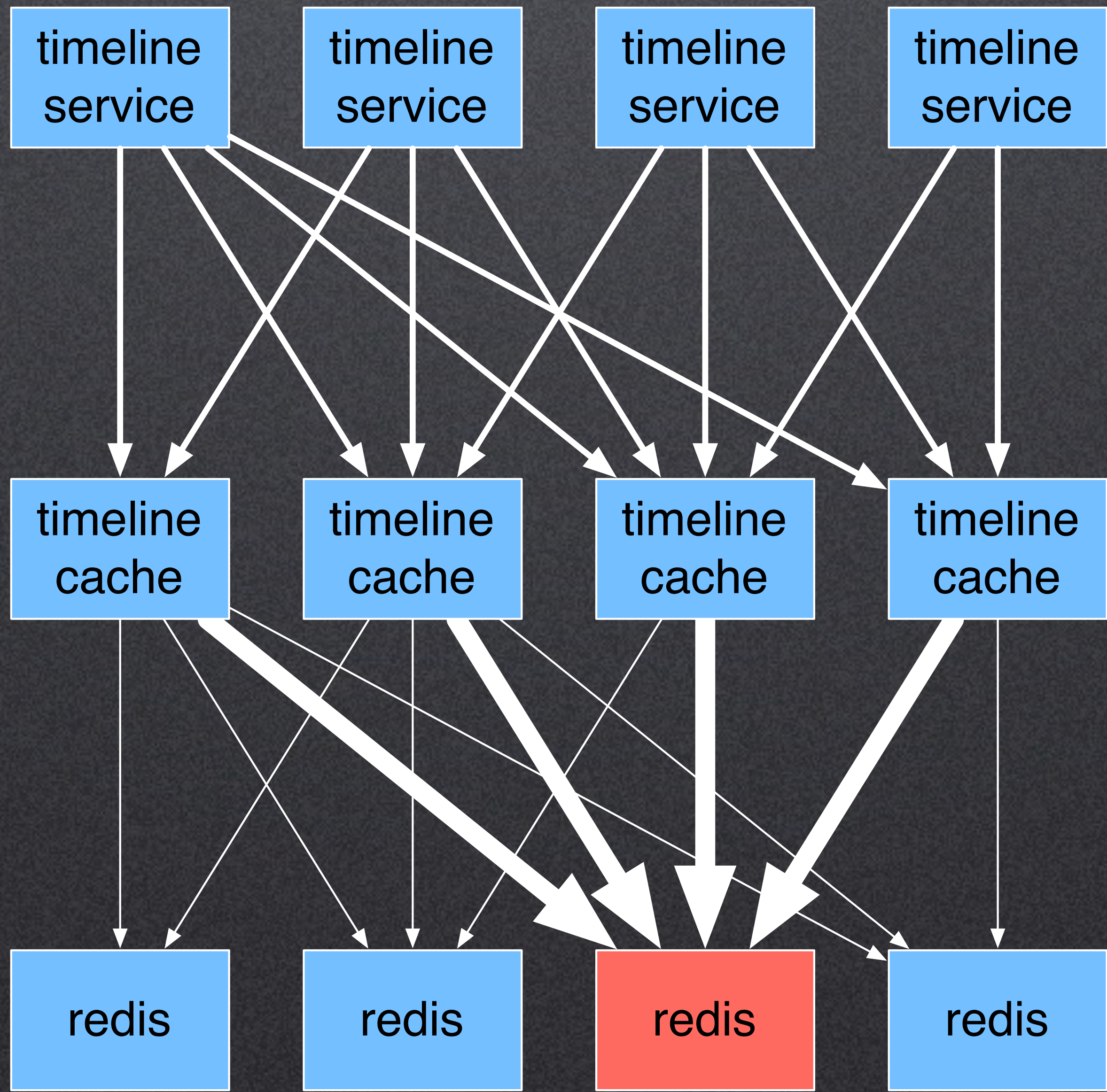
partitioning
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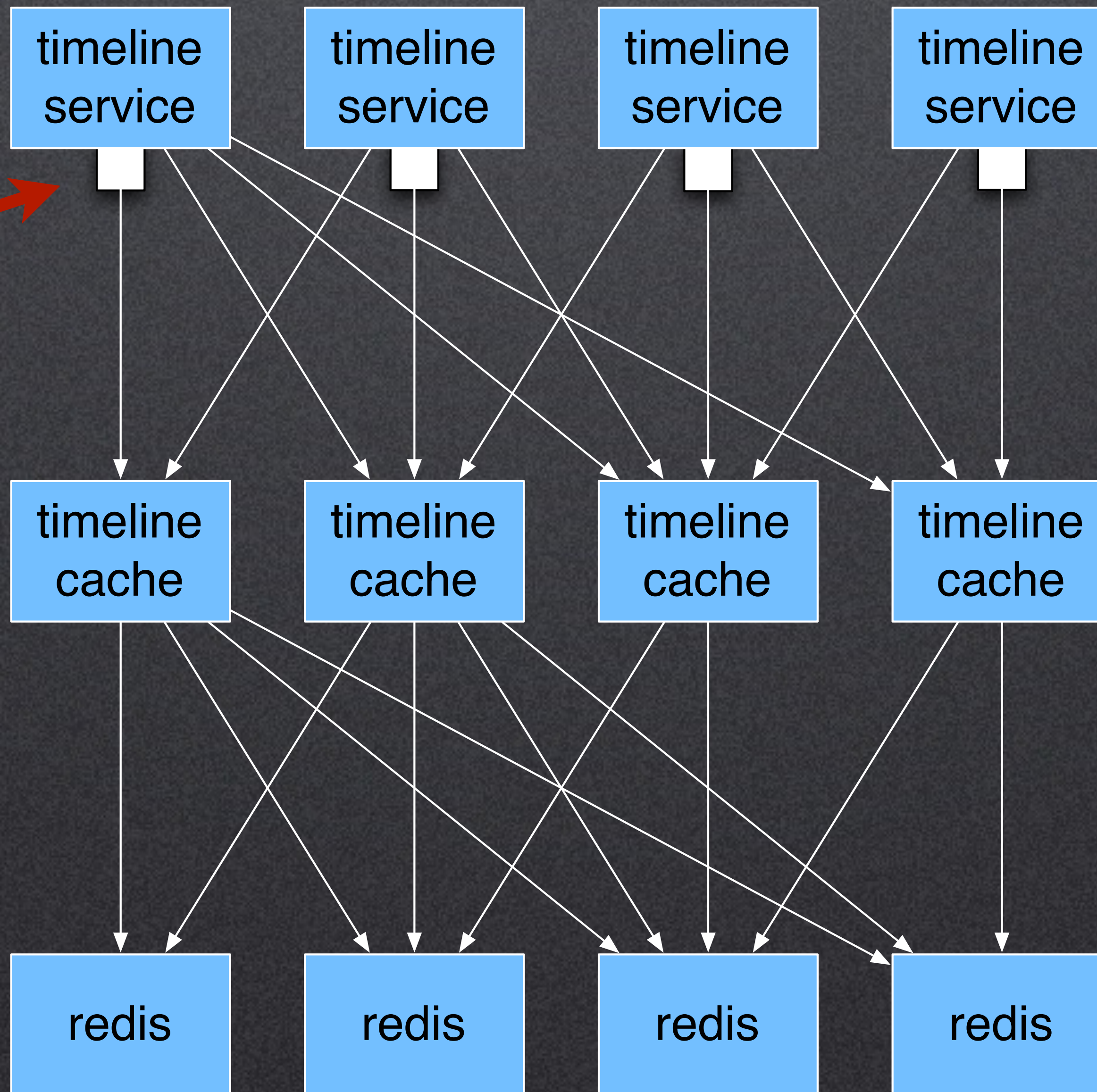




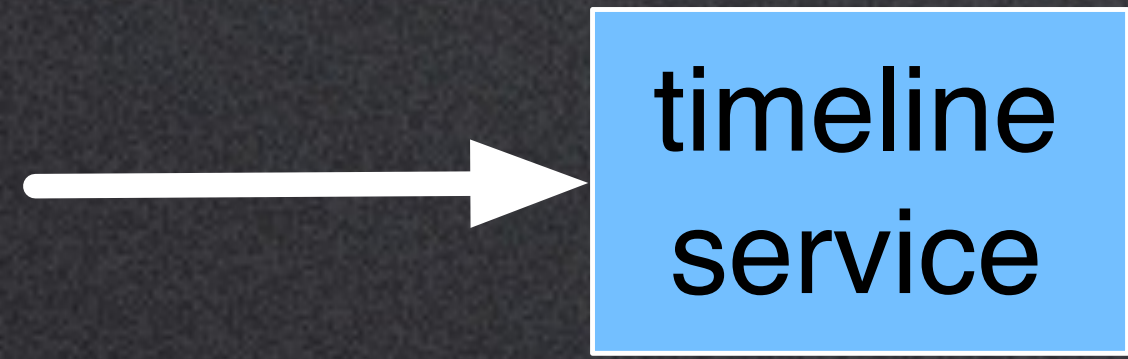




in-process
cache



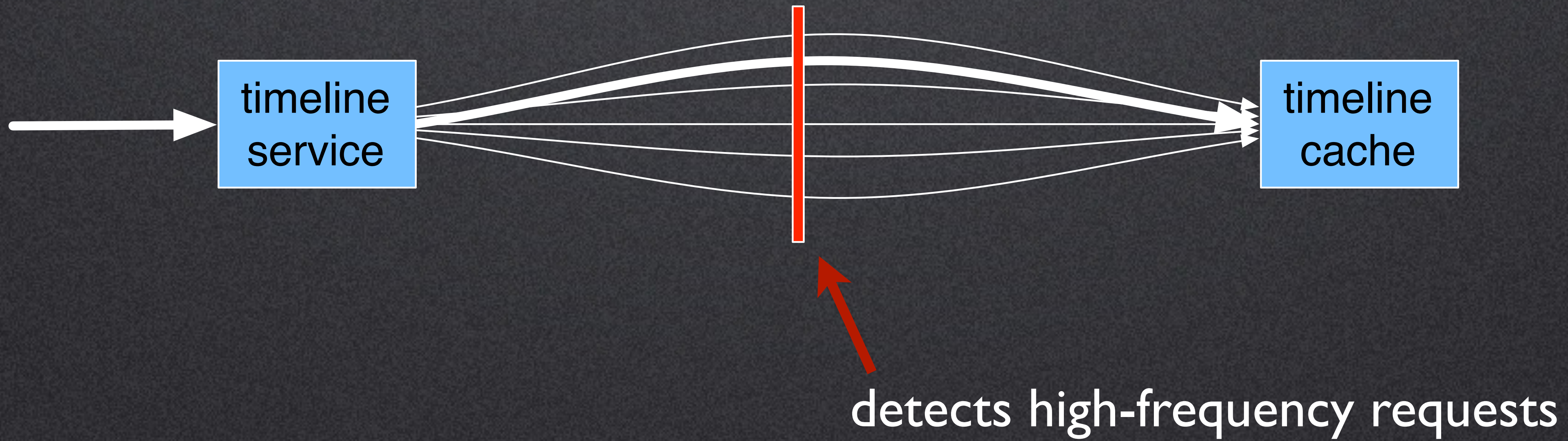
In-Process Cache

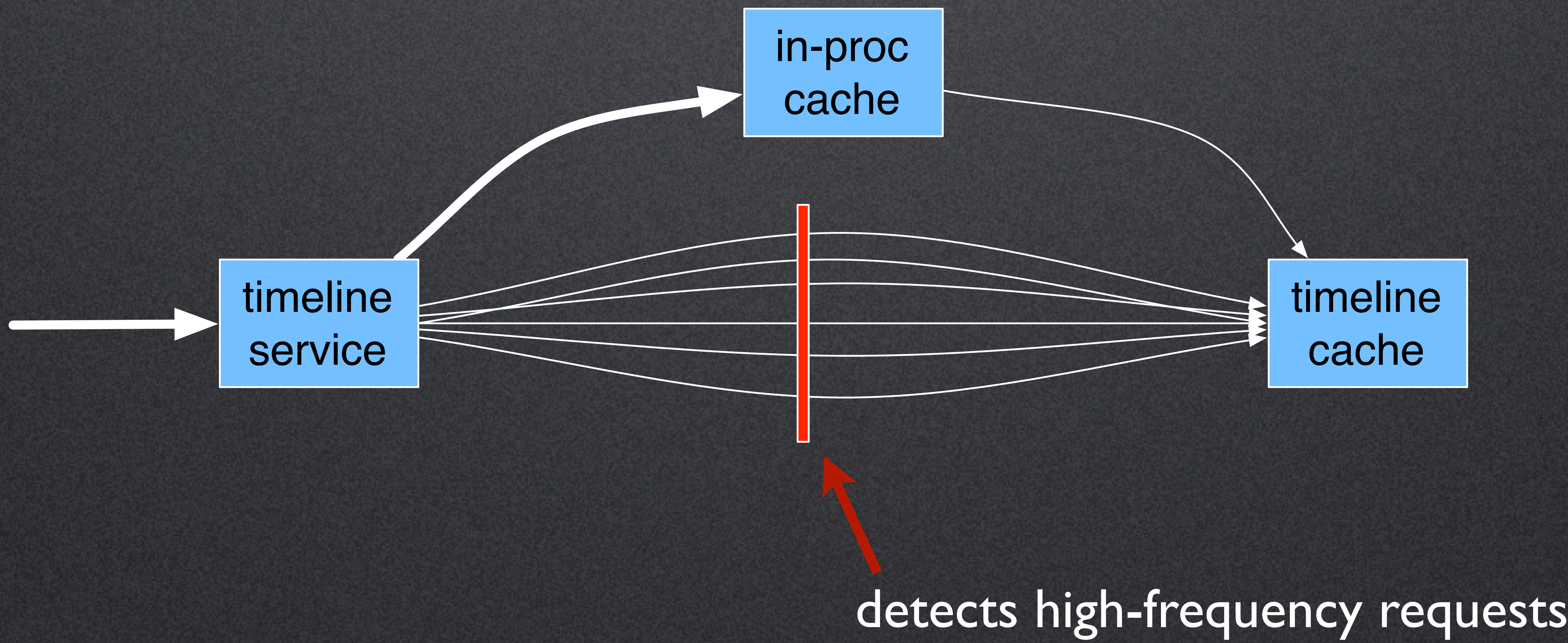












Search

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Vote on the most important software development trends for 2012 t.co/Zaio6Rge, this will be announced in the evening keynote tonight

 **Open Source** @opensource_ 2h
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[#opensource t.co/csHookQv](http://t.co/csHookQv)

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[View photo](#)

What's happening?



hello world|



129

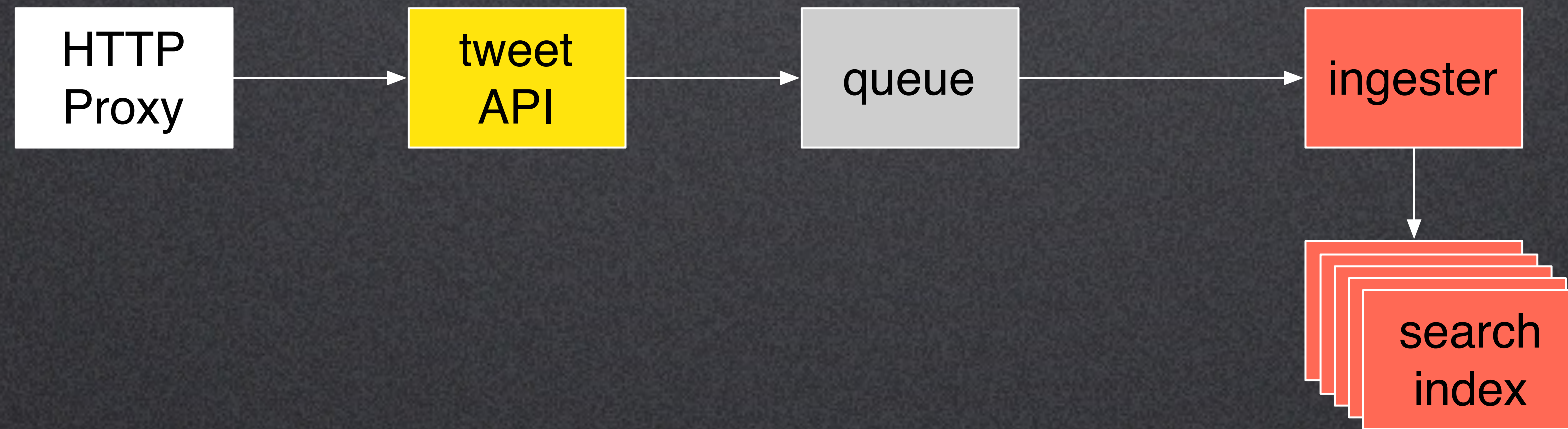
Tweet

HTTP
Proxy









Search

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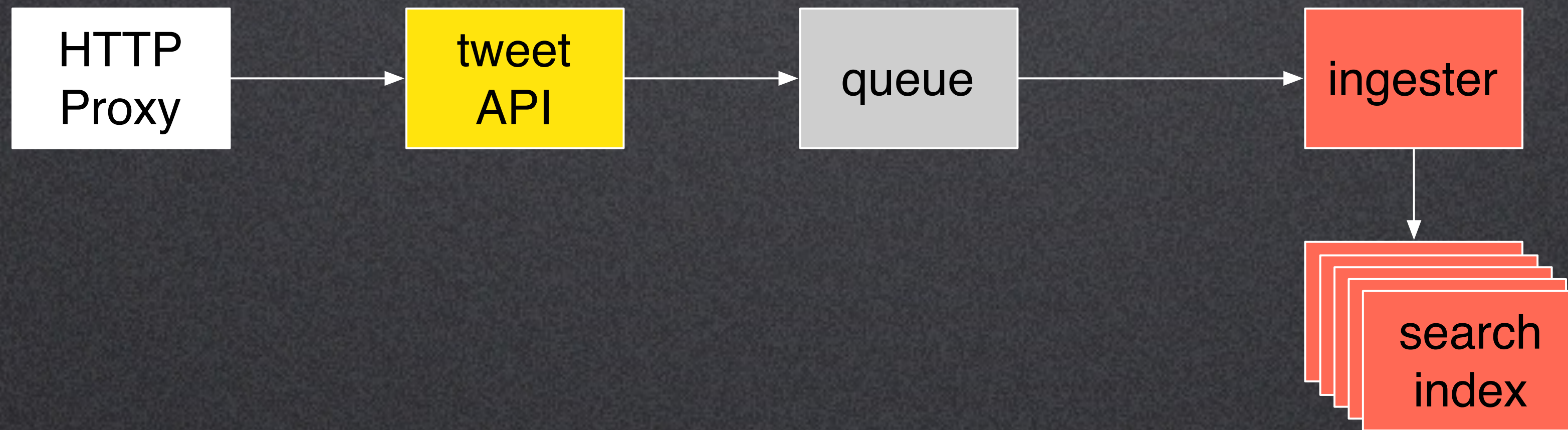
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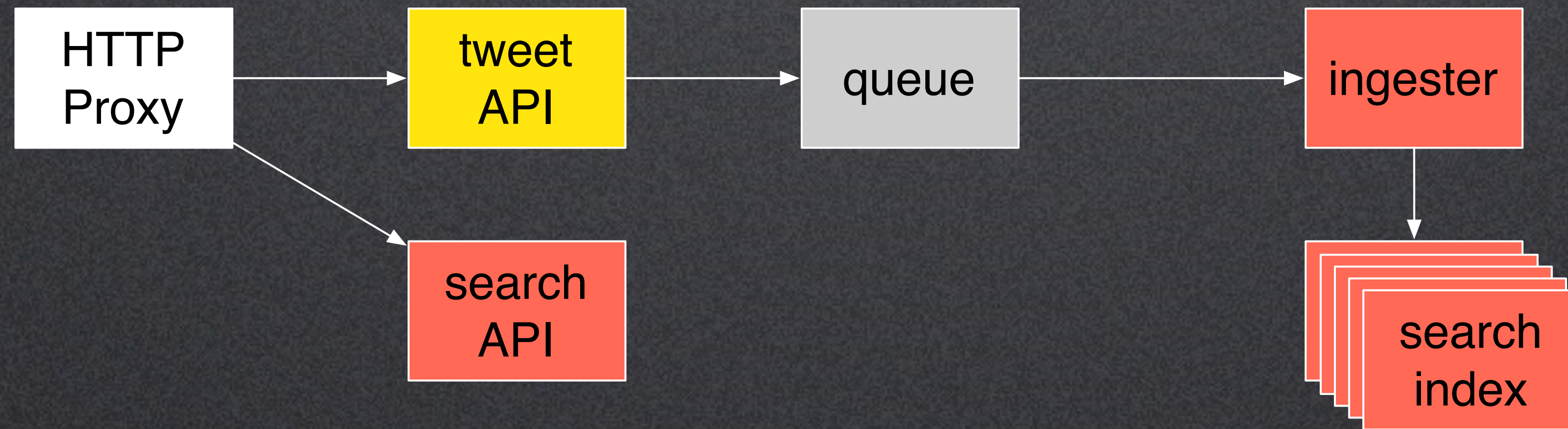
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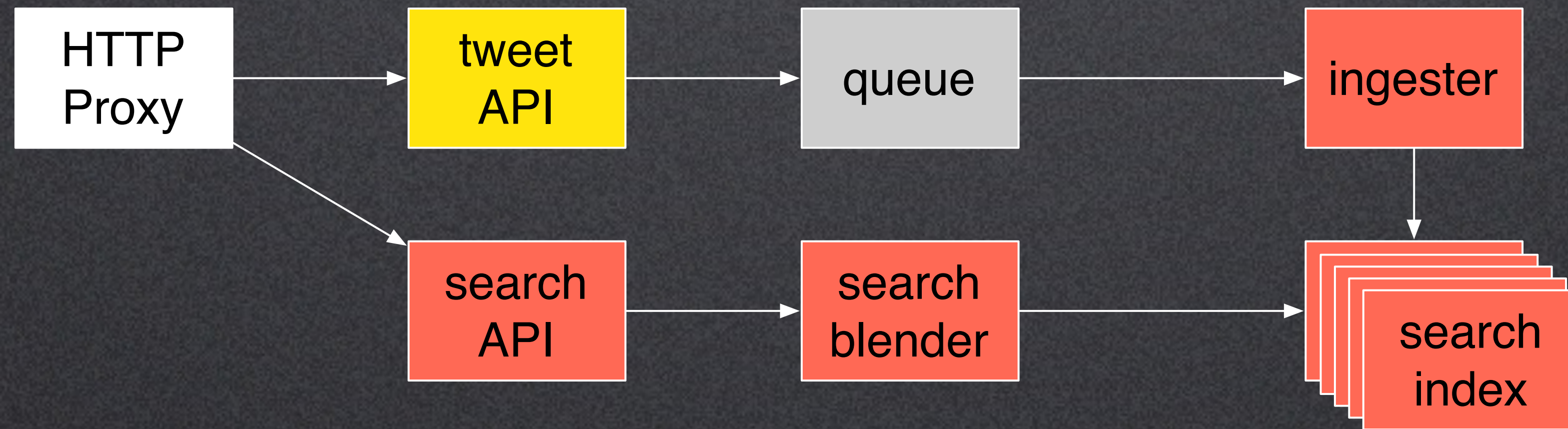
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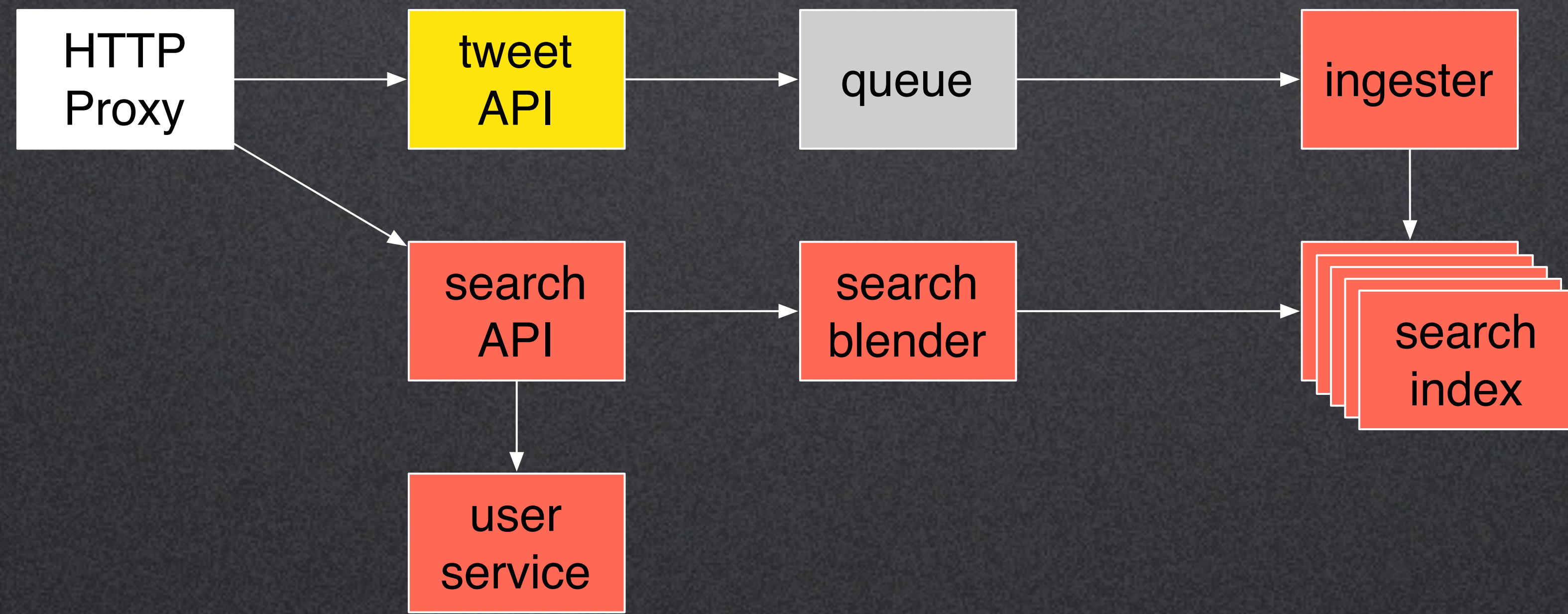
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pic.twitter.com/xLWTrDMC
[View photo](#)













New Tweet



search
blender

search
index

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index

search
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search
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blender

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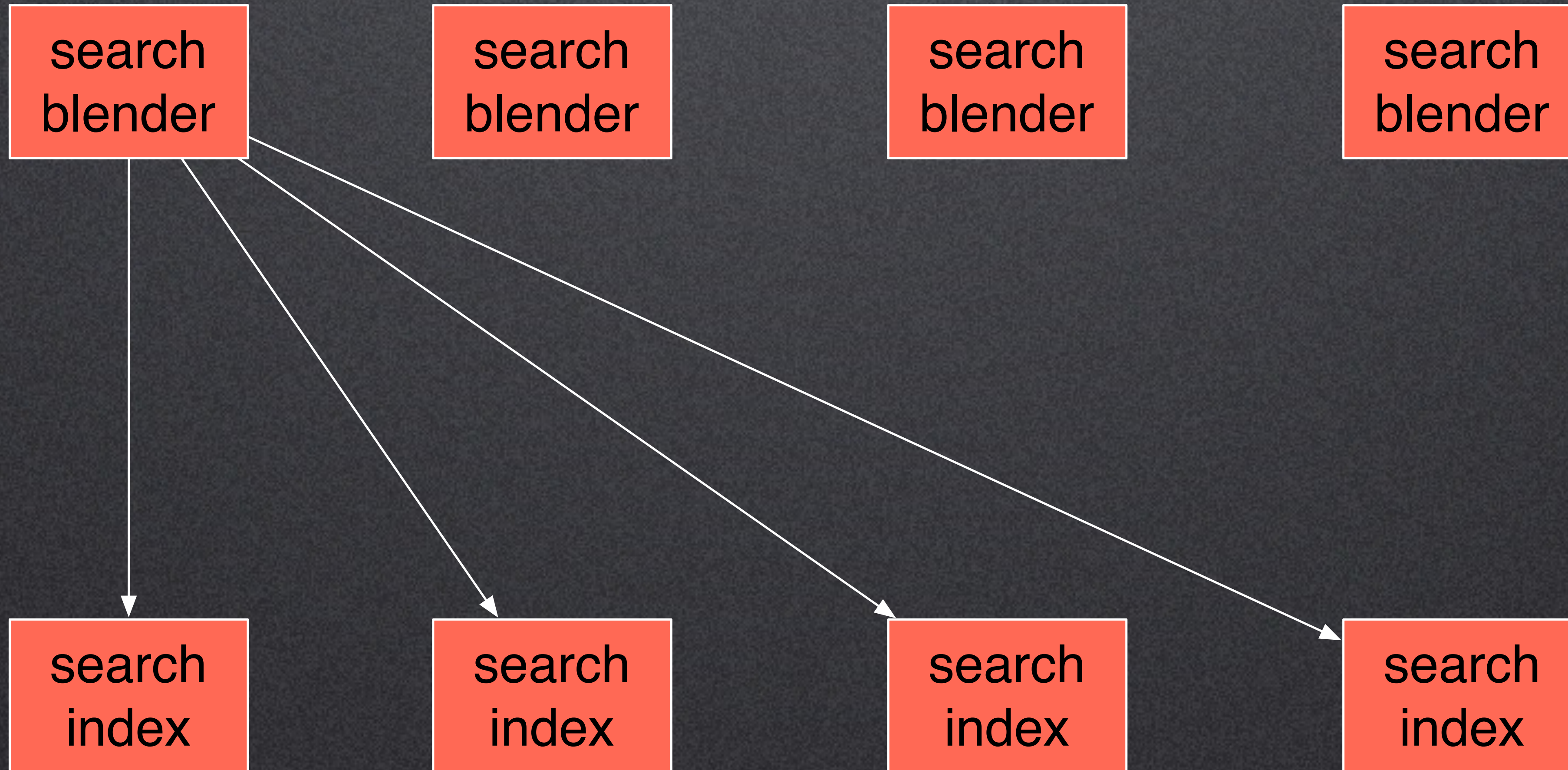
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blender

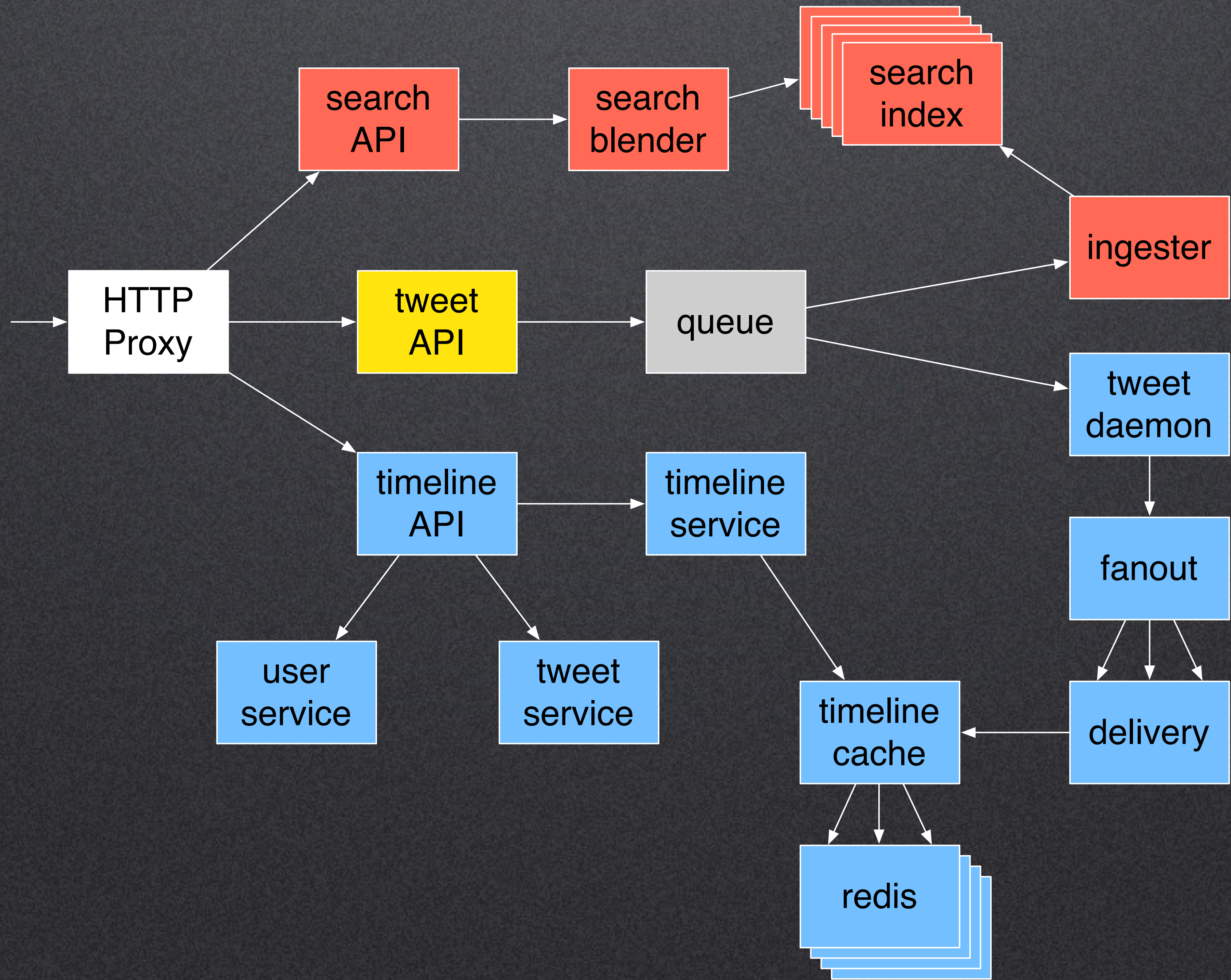
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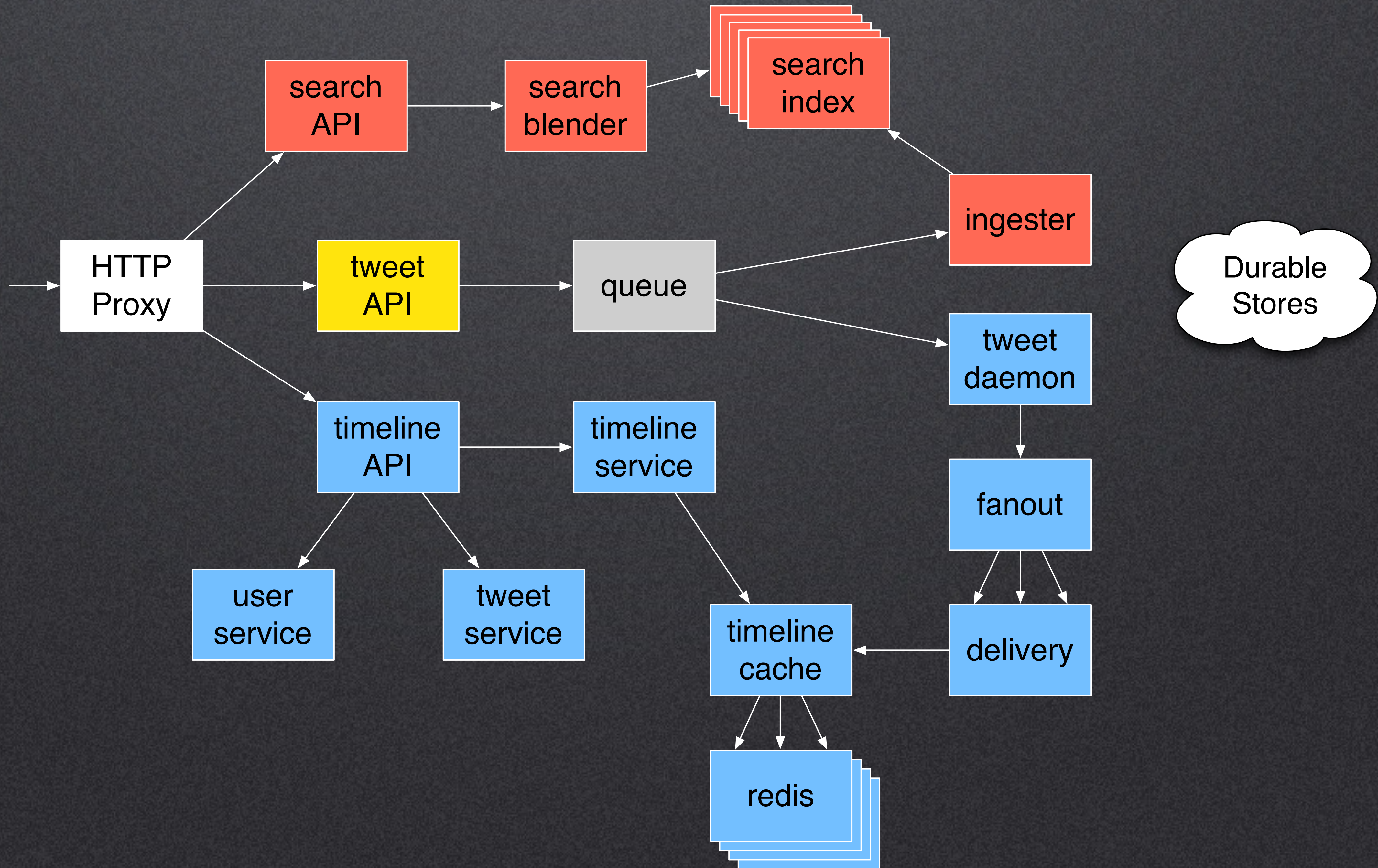
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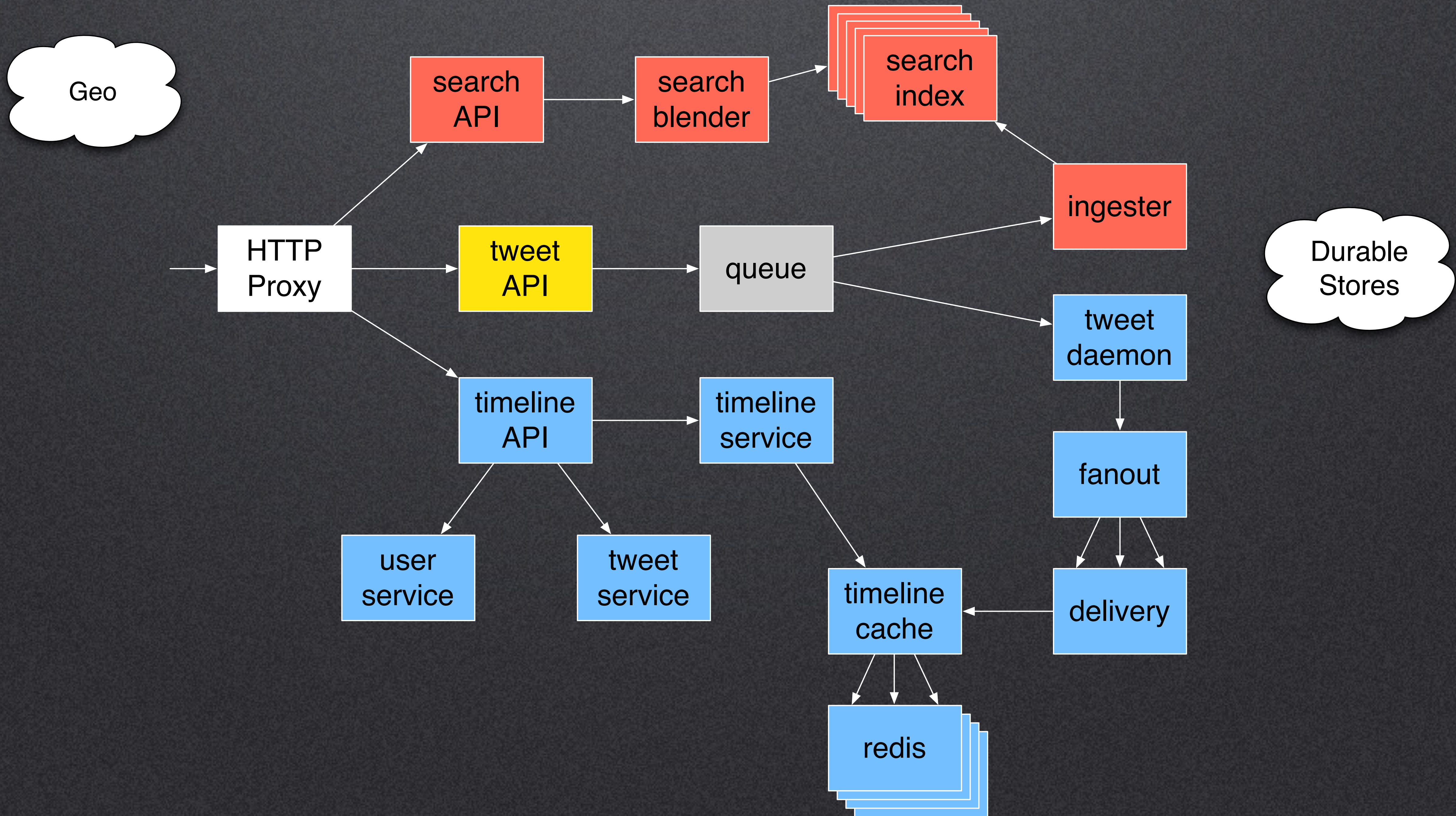
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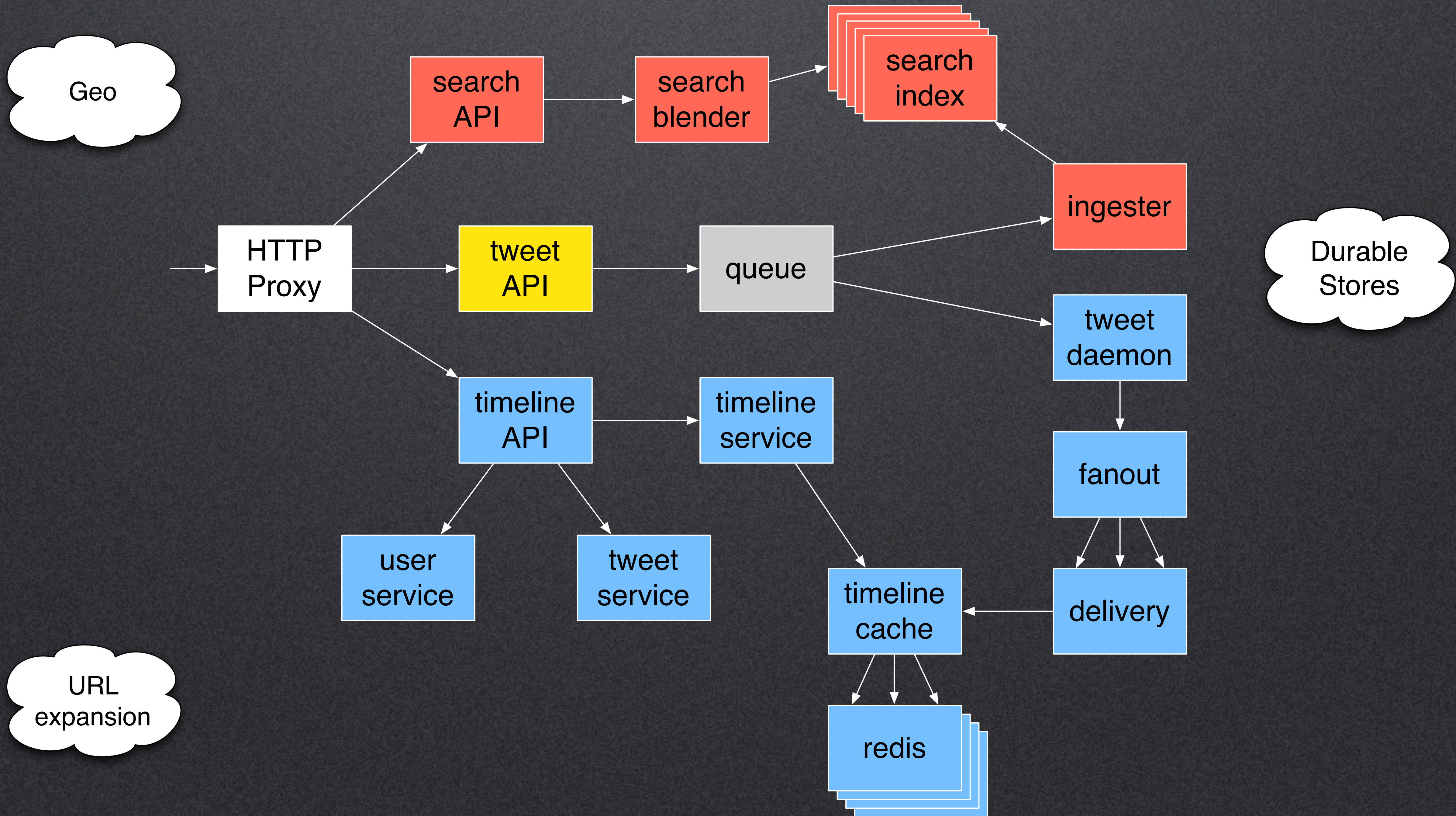
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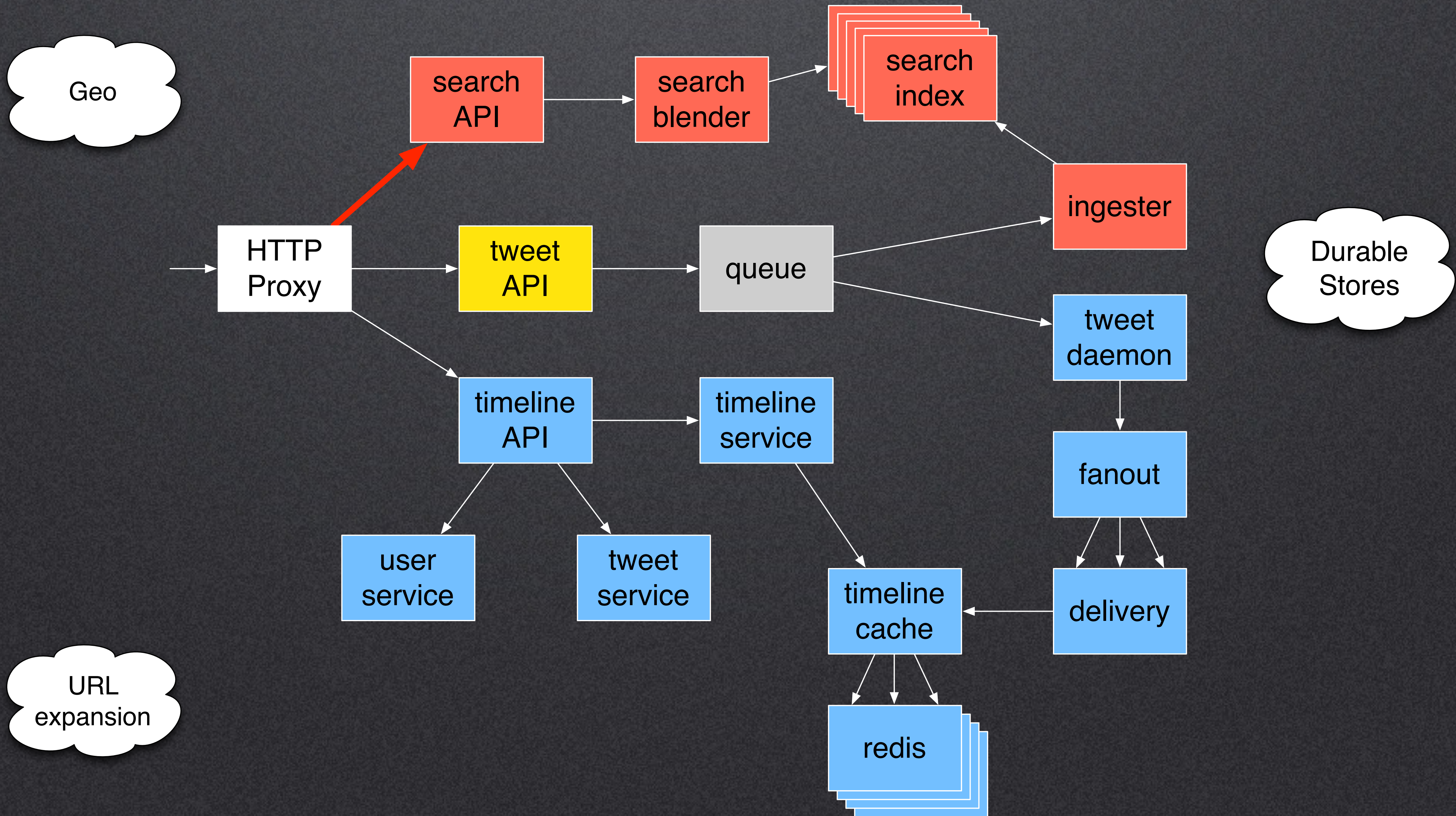


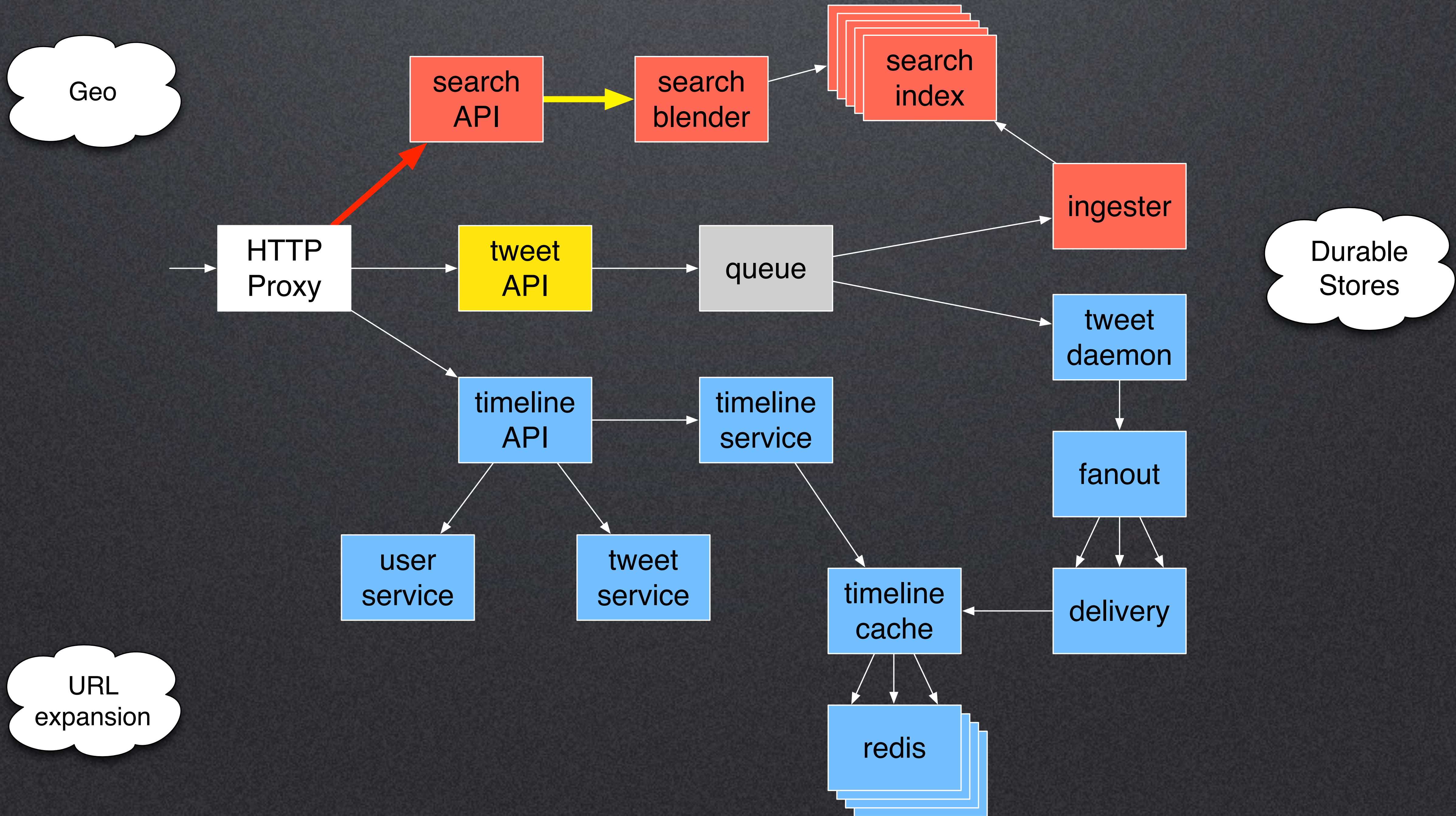


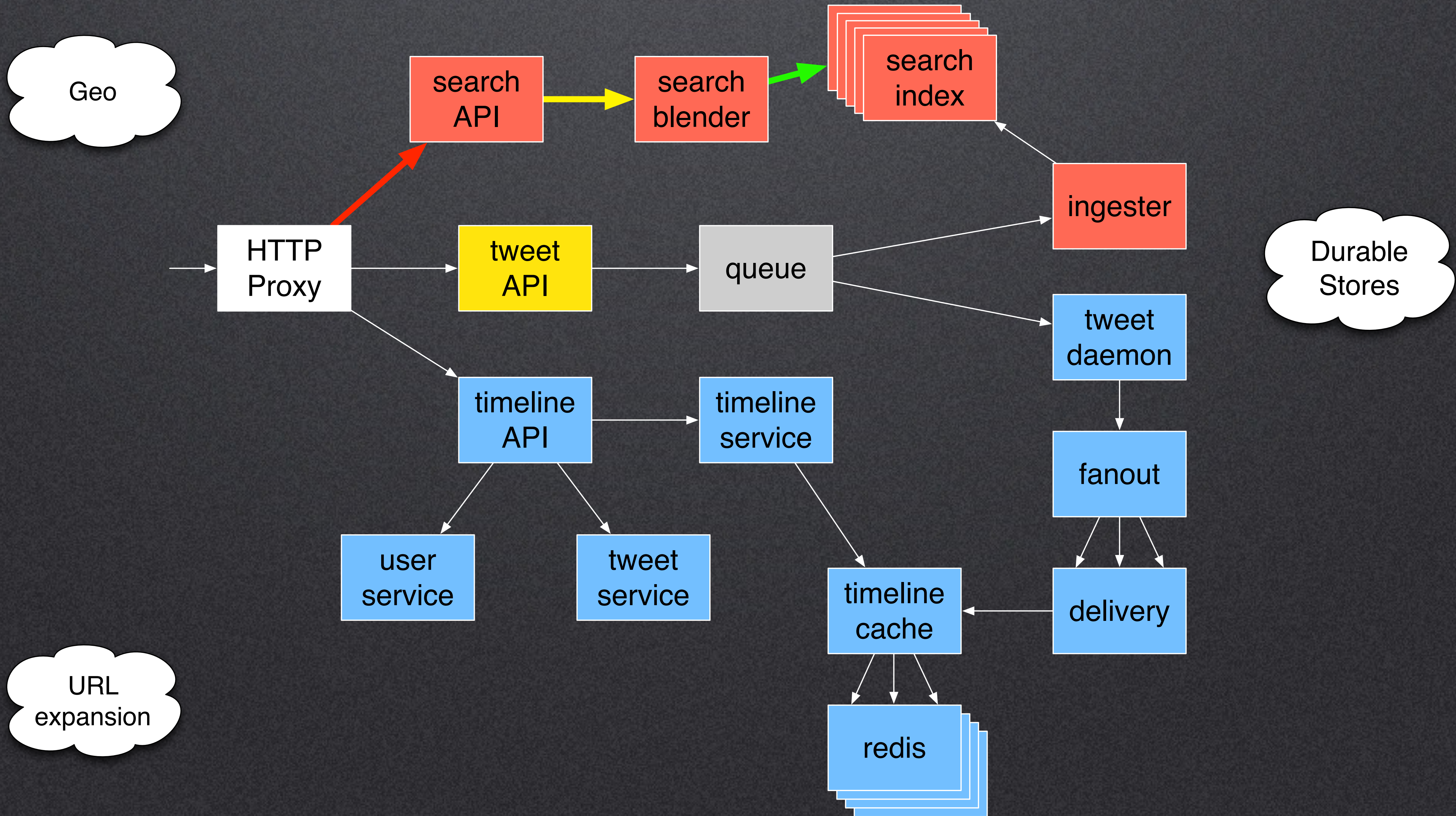


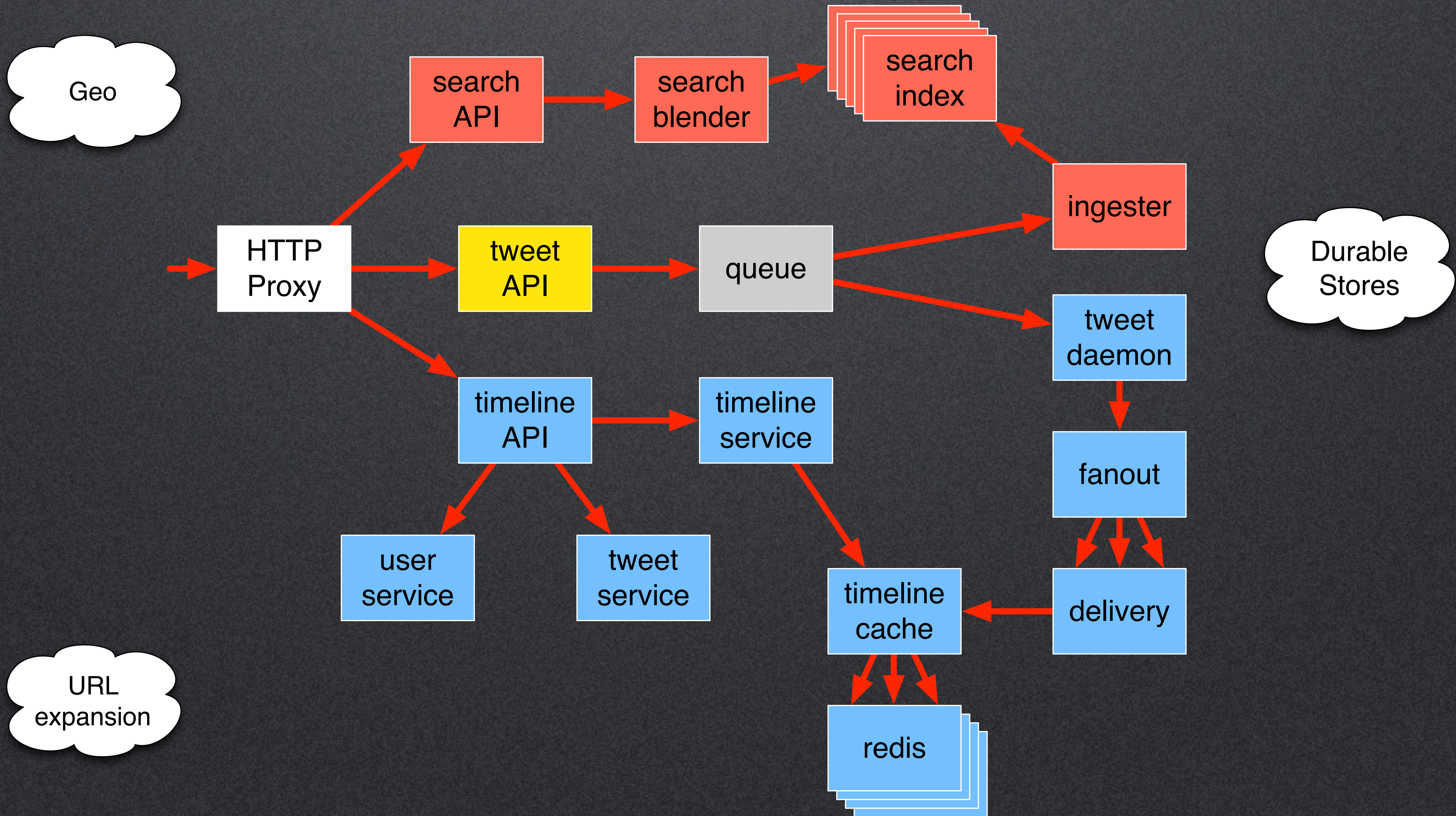












HTTP
Proxy



timeline
API

Finagle - JVM RPC Library

open source:

<http://github.com/twitter/finagle>

Finagle – RPC Common Library

Components

- connection management
- protocol codecs
- transient error handling
- distributed tracing
- service discovery
- observability



Finagle – RPC Common Library

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- service discovery
- observability



Building a client

```
ClientBuilder()  
  .cluster(TimelineServiceCluster)  
  .hostConnectionCoresize(5)  
  .hostConnectionLimit(10)  
  .hostConnectionIdleTime(5.seconds)  
  .failureAccrualParams(5, 10.seconds)  
  .retries(3)  
  .timeout(500.milliseconds)
```

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ClientBuilder()
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  .hostConnectionIdleTime(5.seconds)
  .failureAccrualParams(5, 10.seconds)
  .retries(3)
  .timeout(500.milliseconds)
```

Building a client

```
ClientBuilder()  
  .cluster(TimelineServiceCluster)  
  .hostConnectionCoresize(5)  
  .hostConnectionLimit(10)  
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```

Finagle – RPC Common Library

Components

- connection management
- protocol codecs
- transient error handling
- distributed tracing
- service discovery
- observability

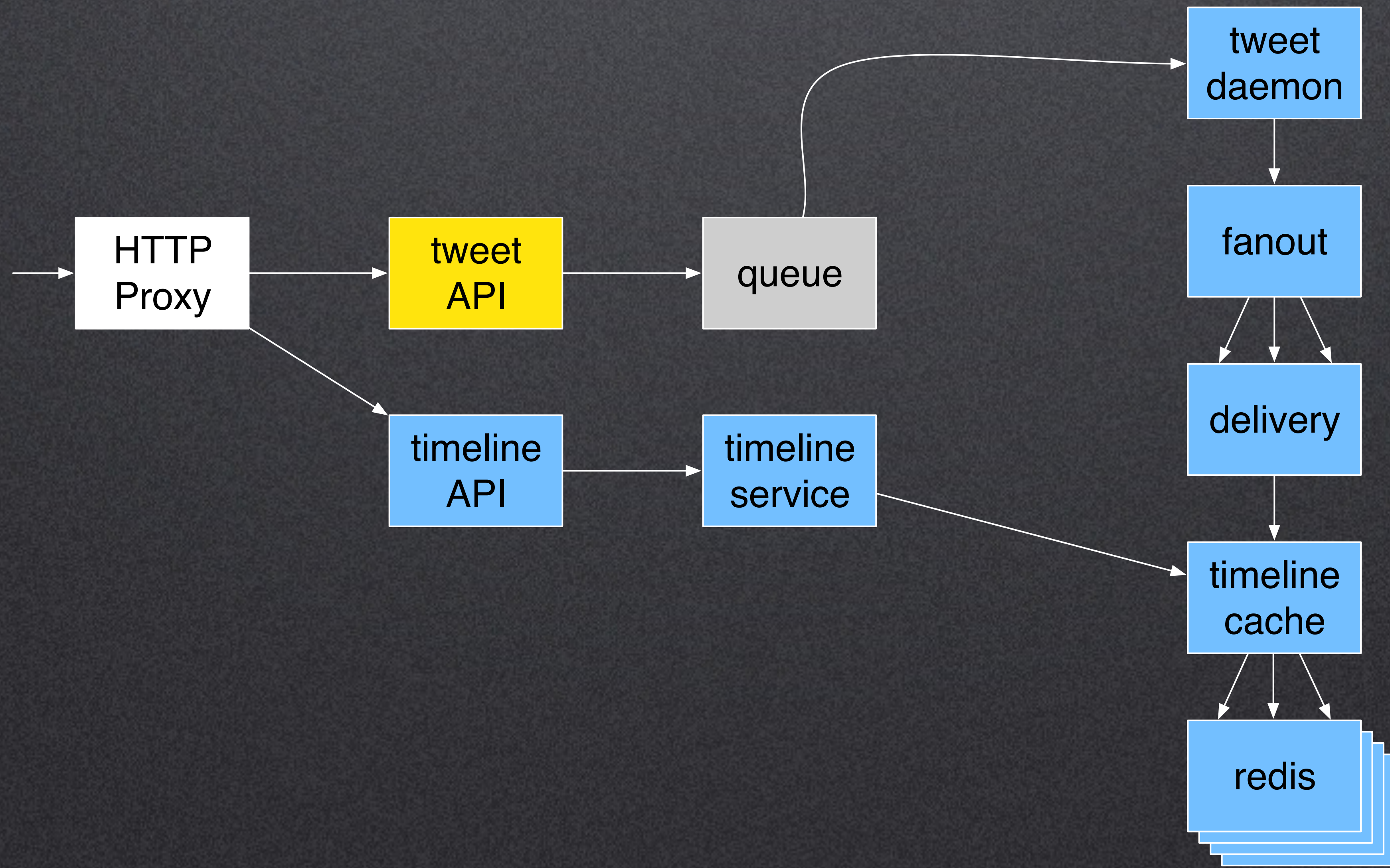


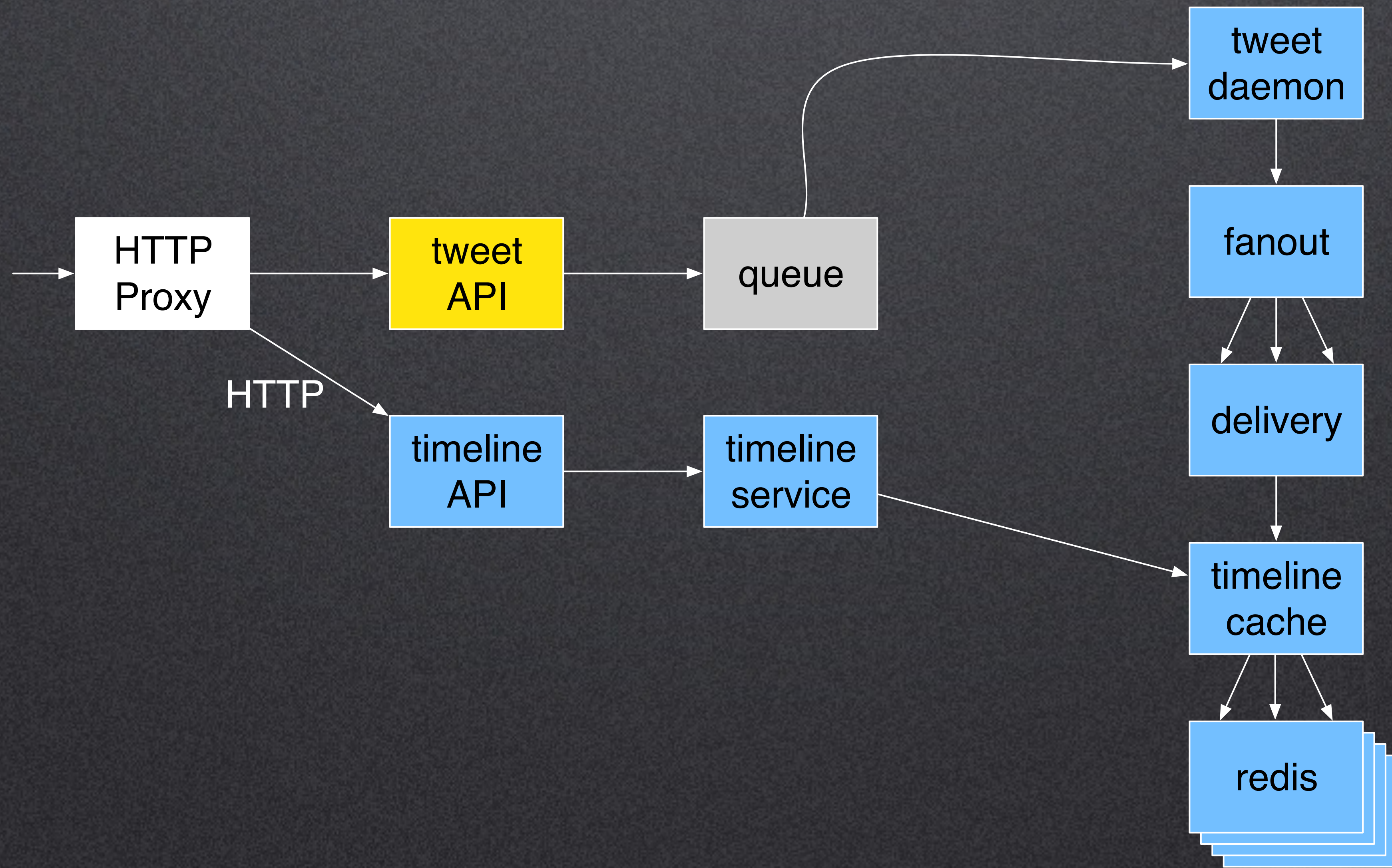
Finagle – RPC Common Library

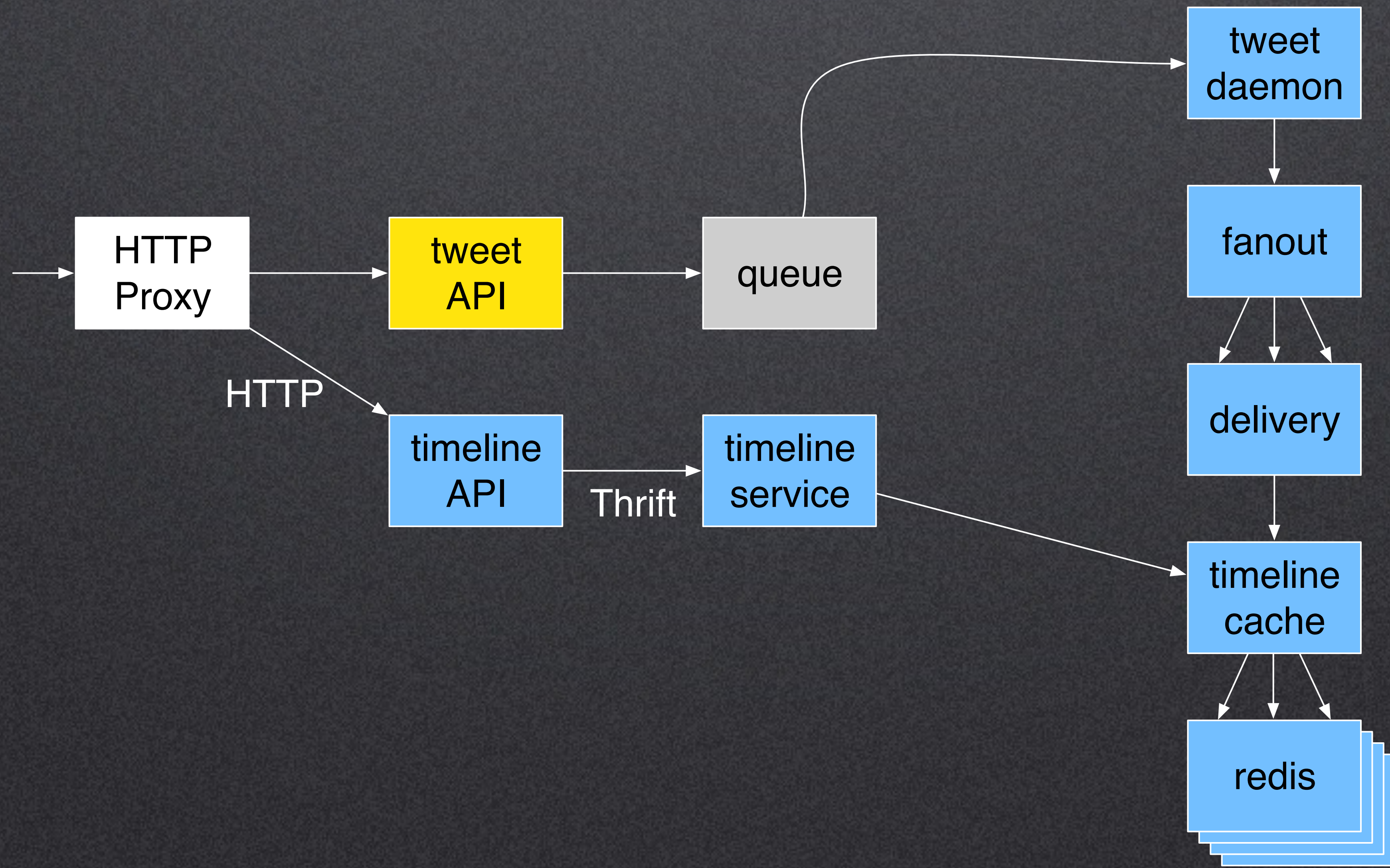
Components

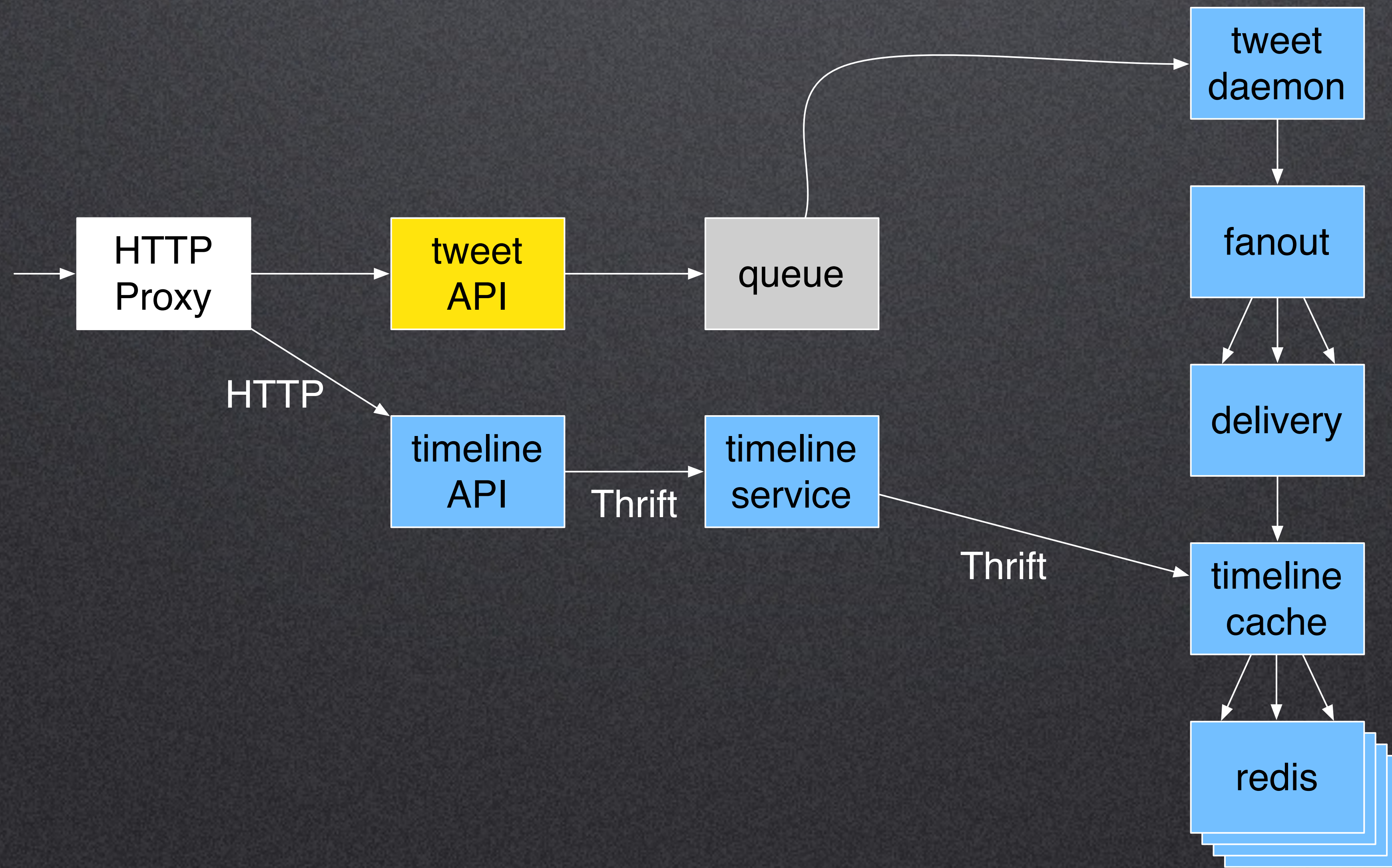
- connection management
- **protocol codecs**
- transient error handling
- distributed tracing
- service discovery
- observability

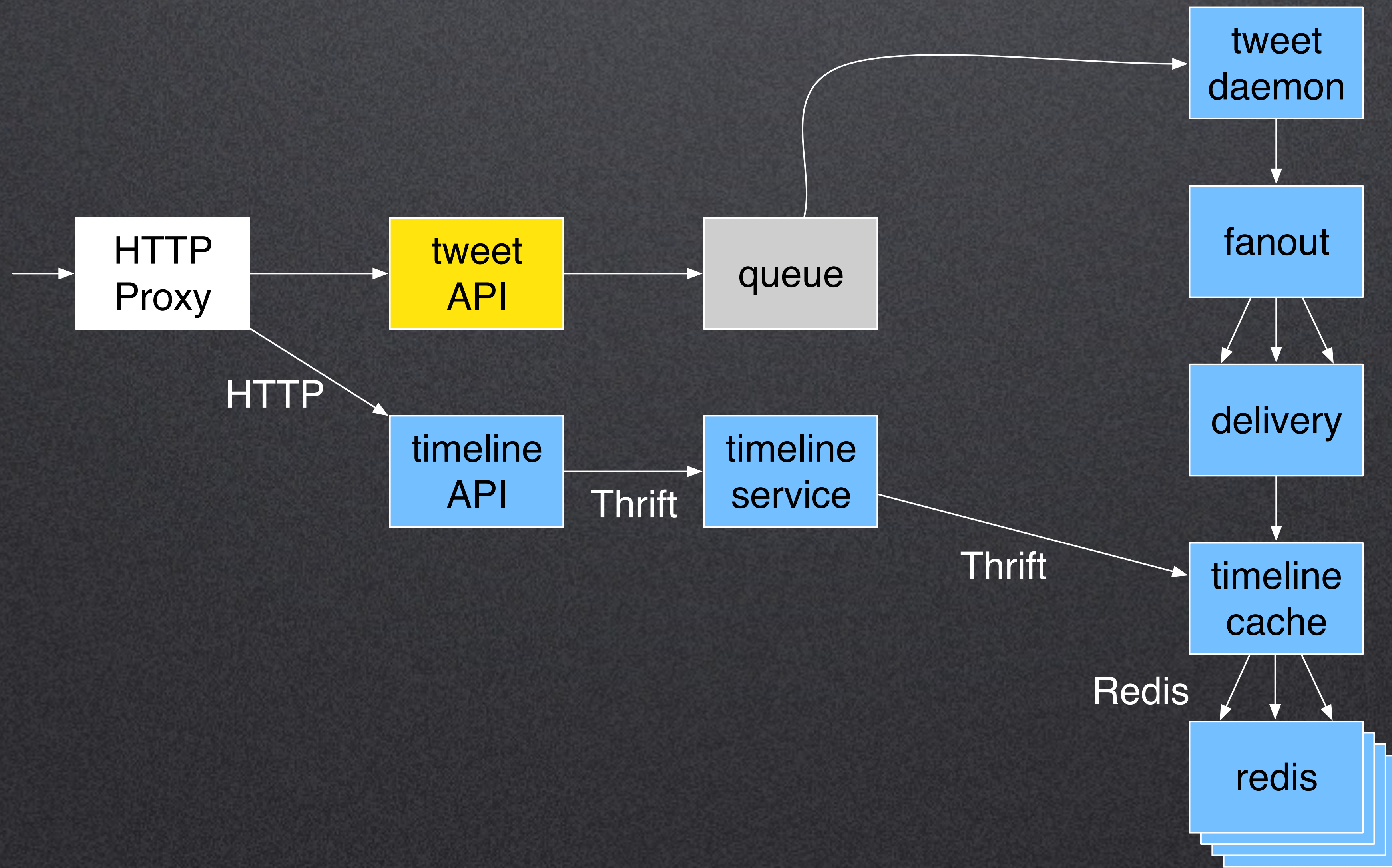












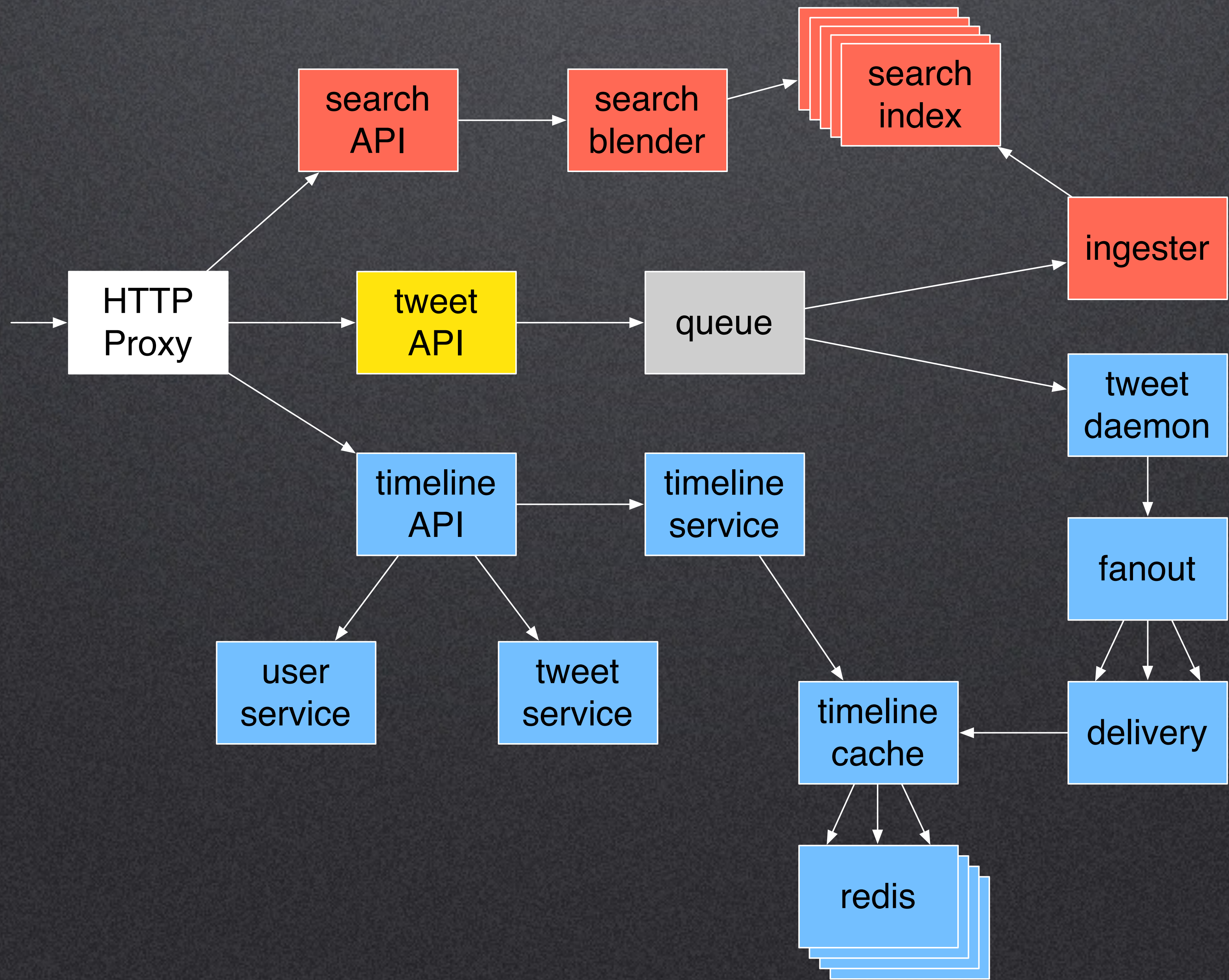
Finagle – RPC Common Library

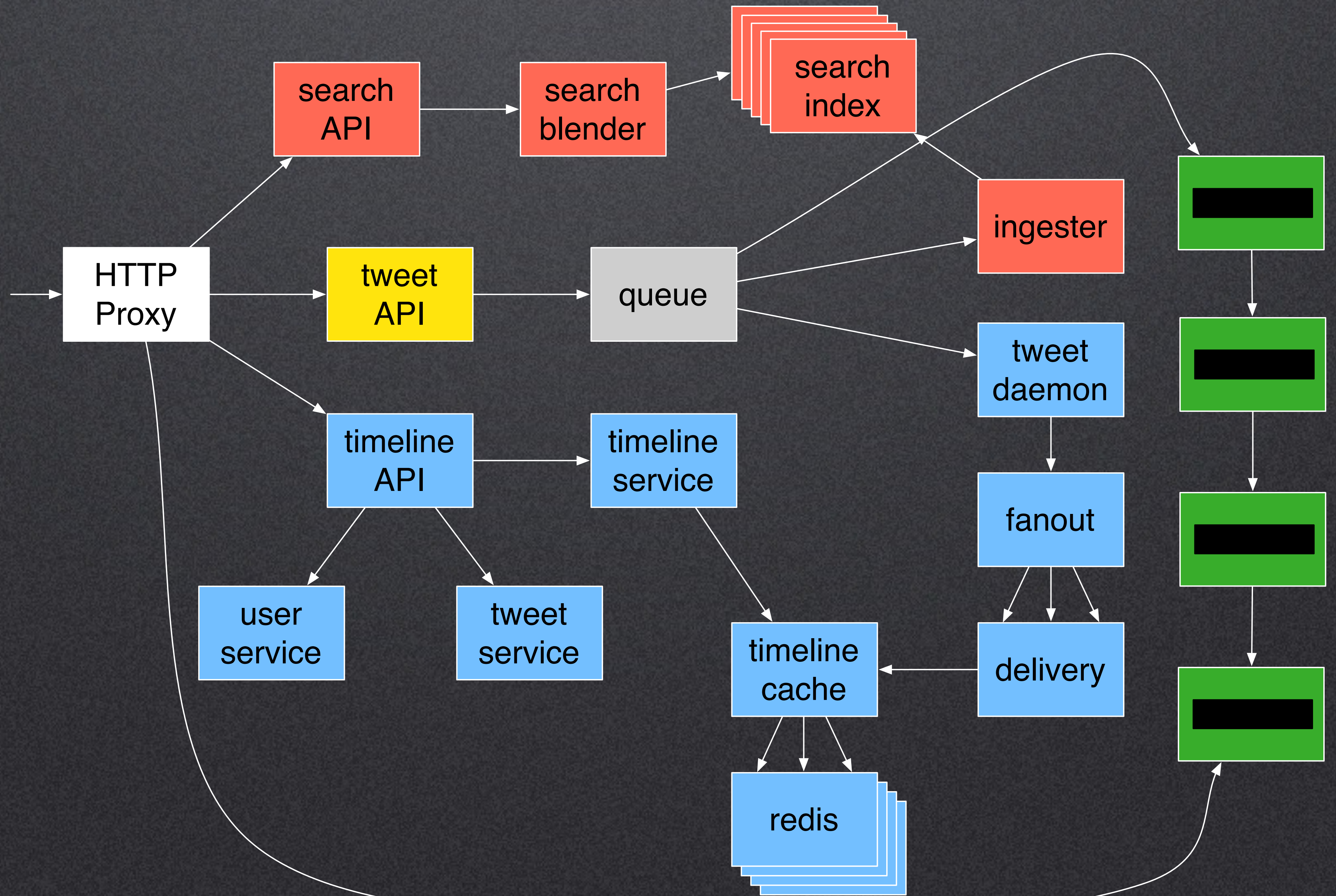
Components

- connection management
- protocol codecs
- transient error handling
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- service discovery
- observability

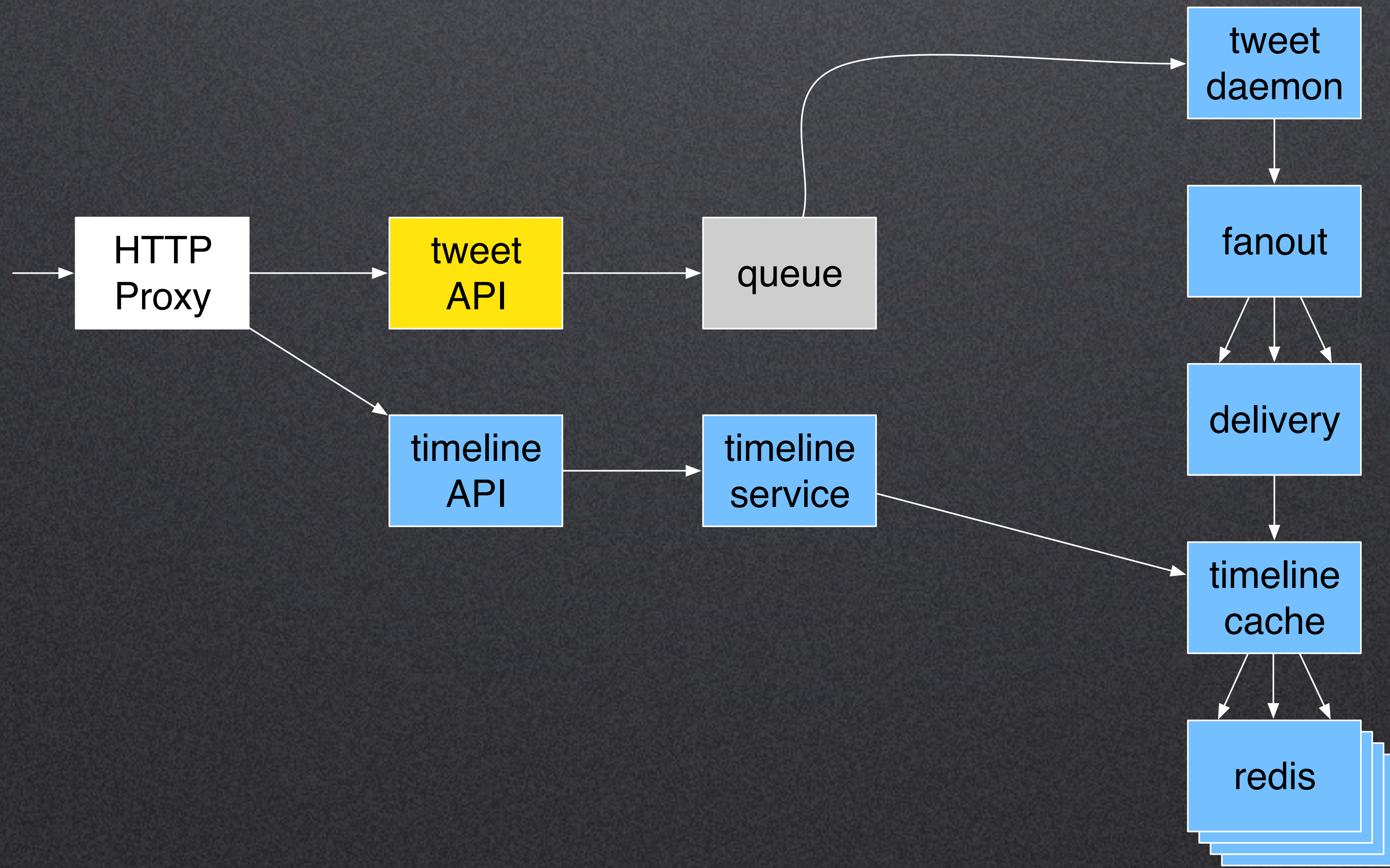


Looking Forward



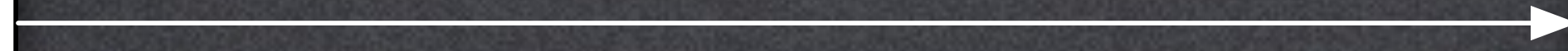


Case Study

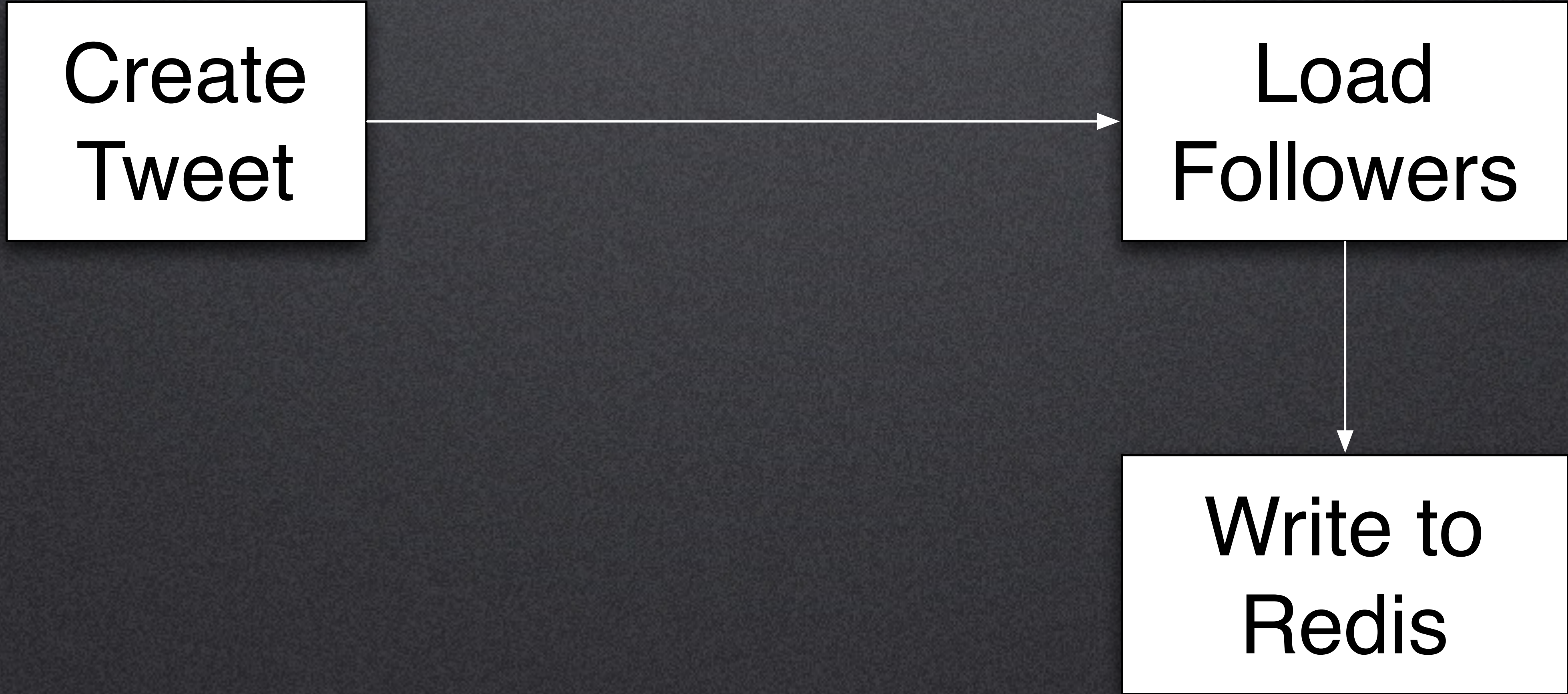


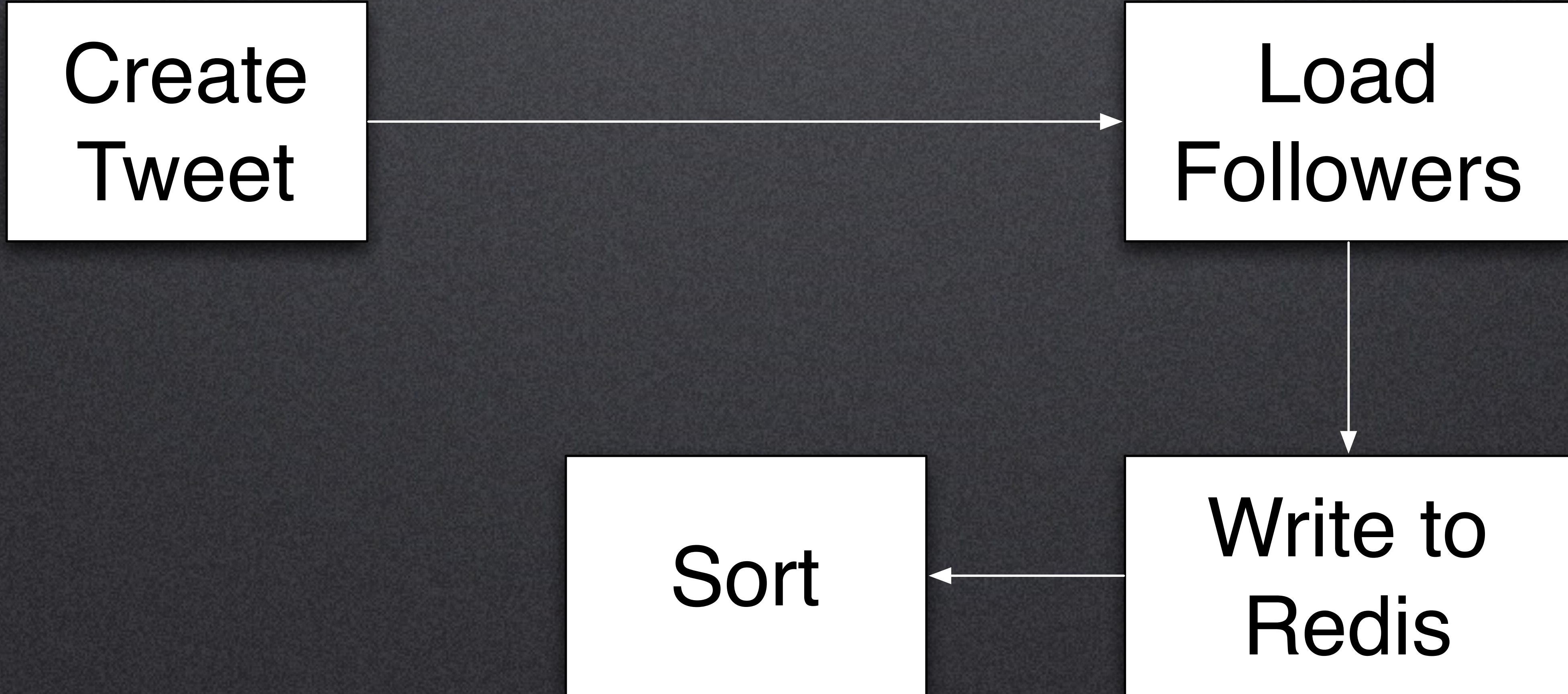
Create
Tweet

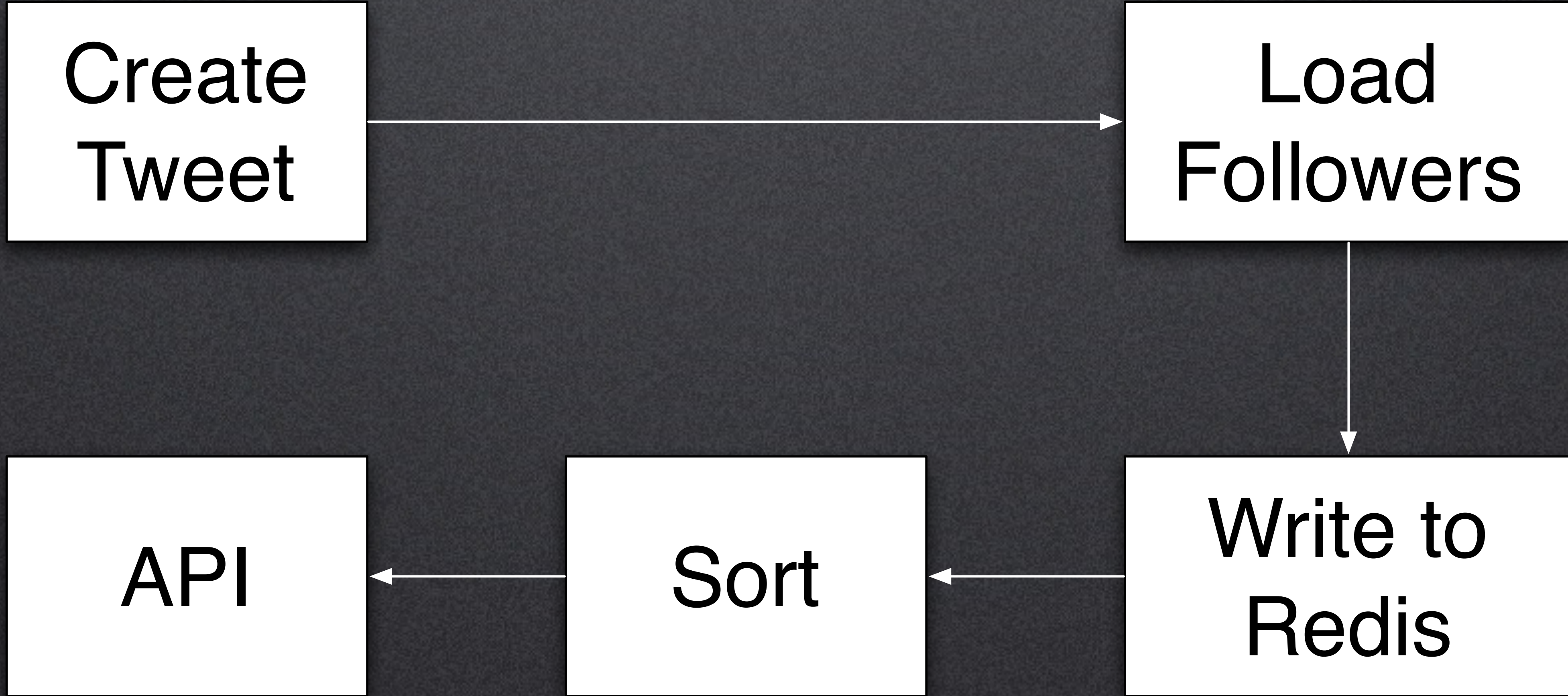
Create
Tweet

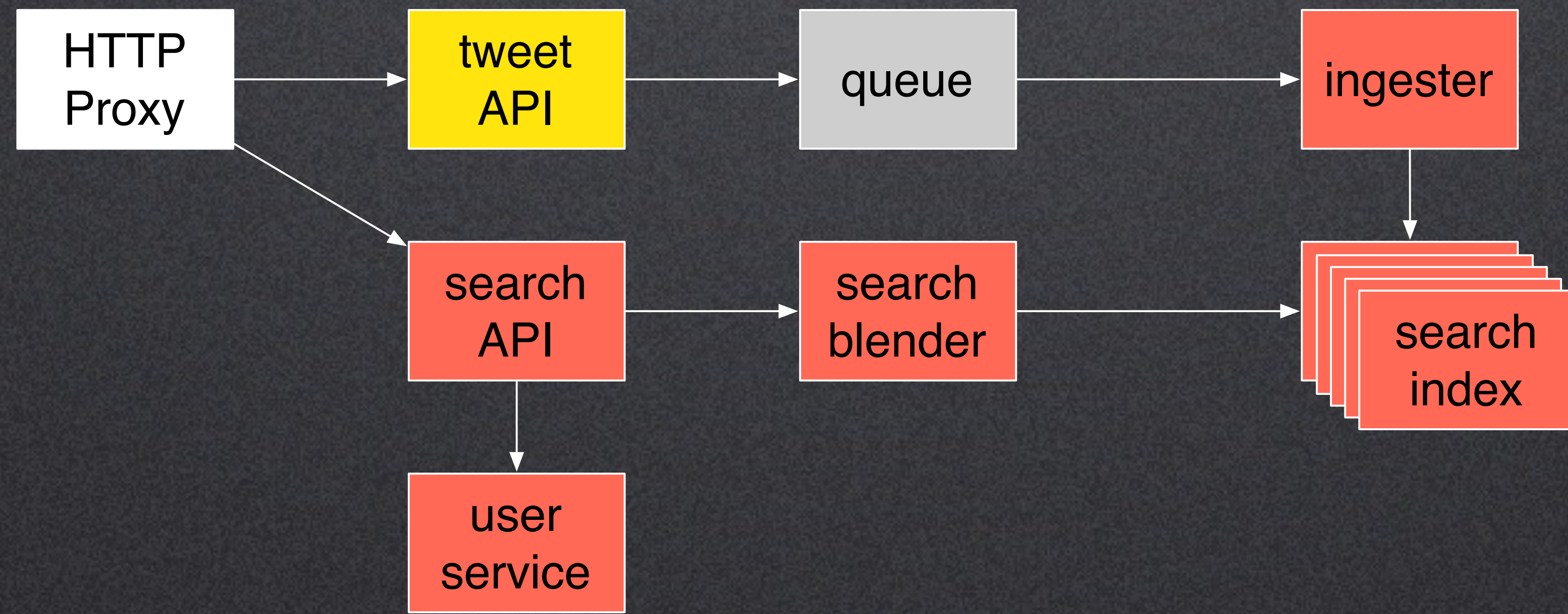


Load
Followers









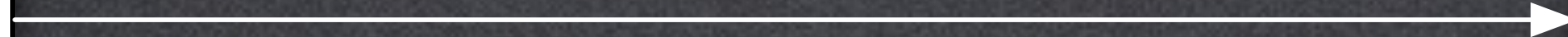
Create
Tweet

Create
Tweet



Tokenize

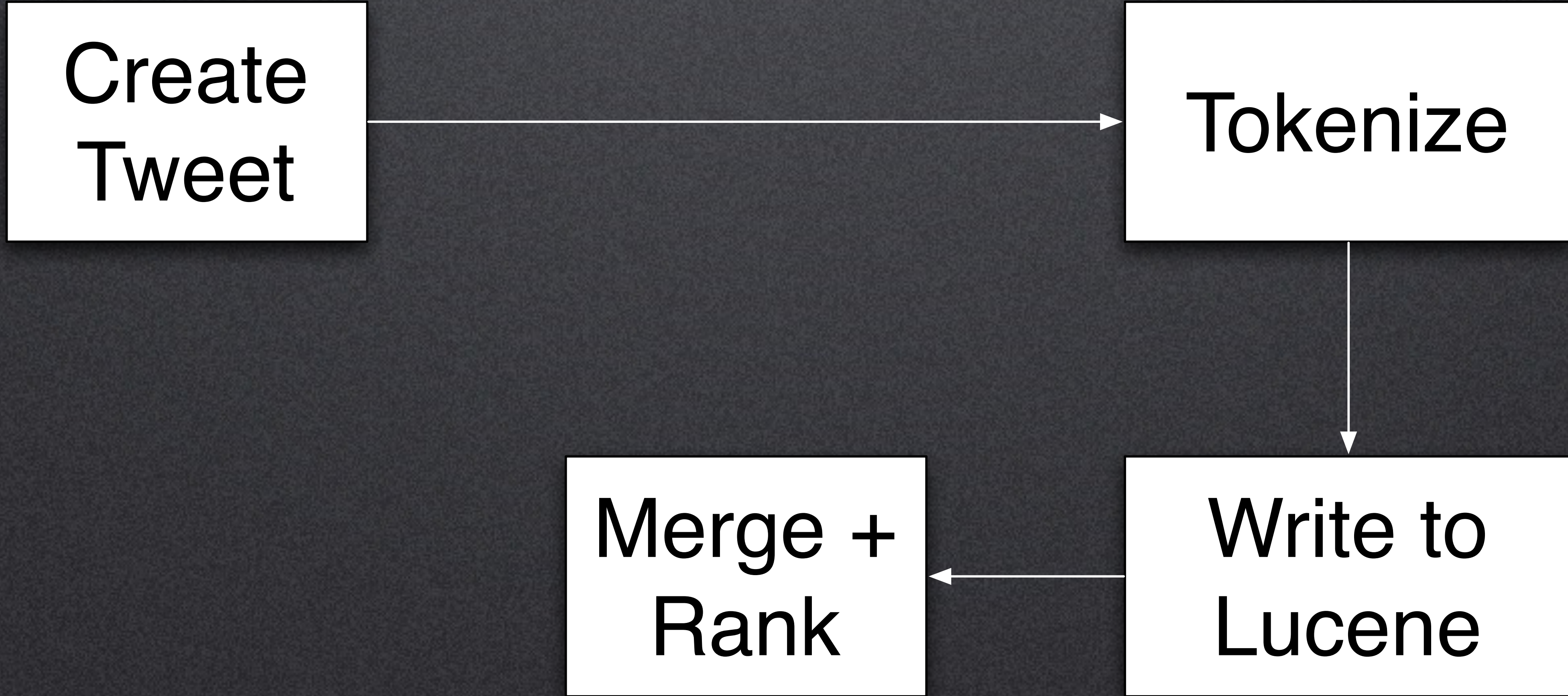
Create
Tweet

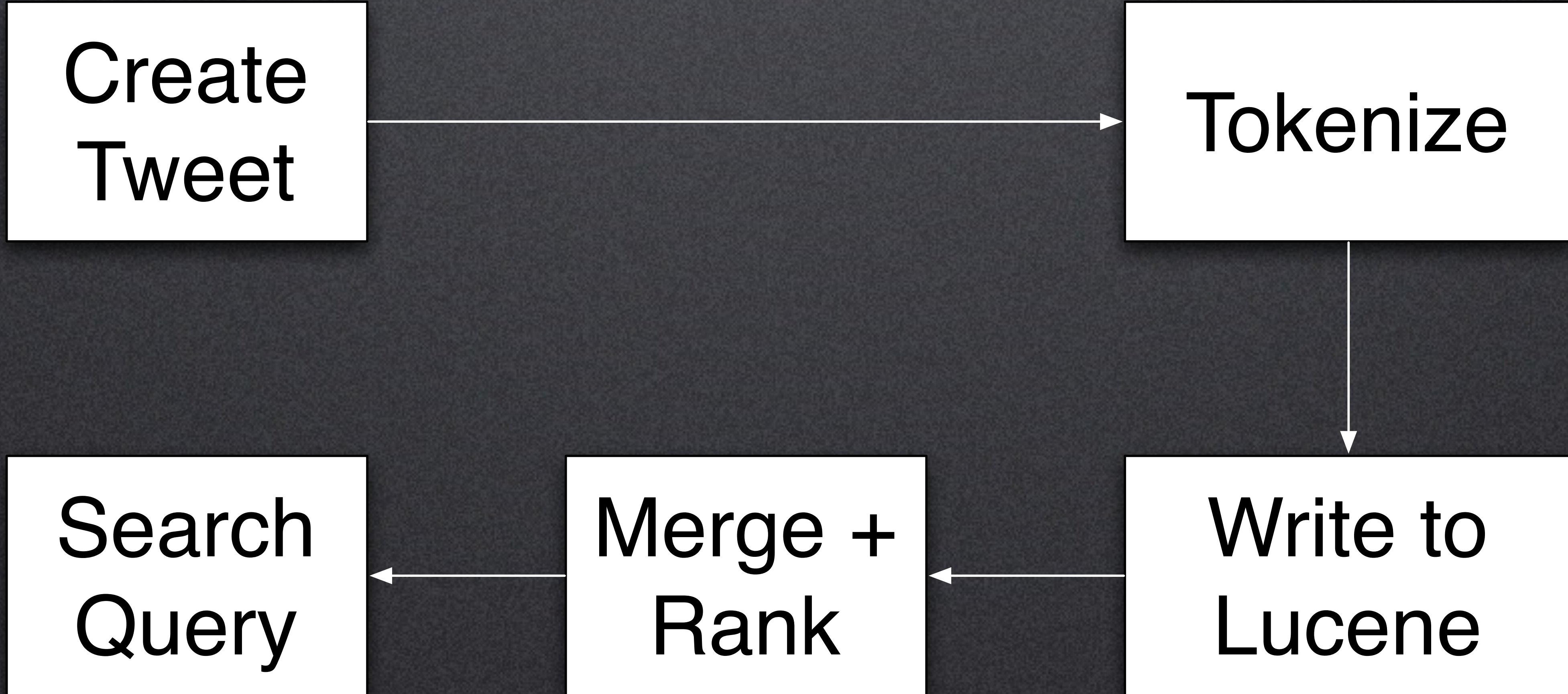


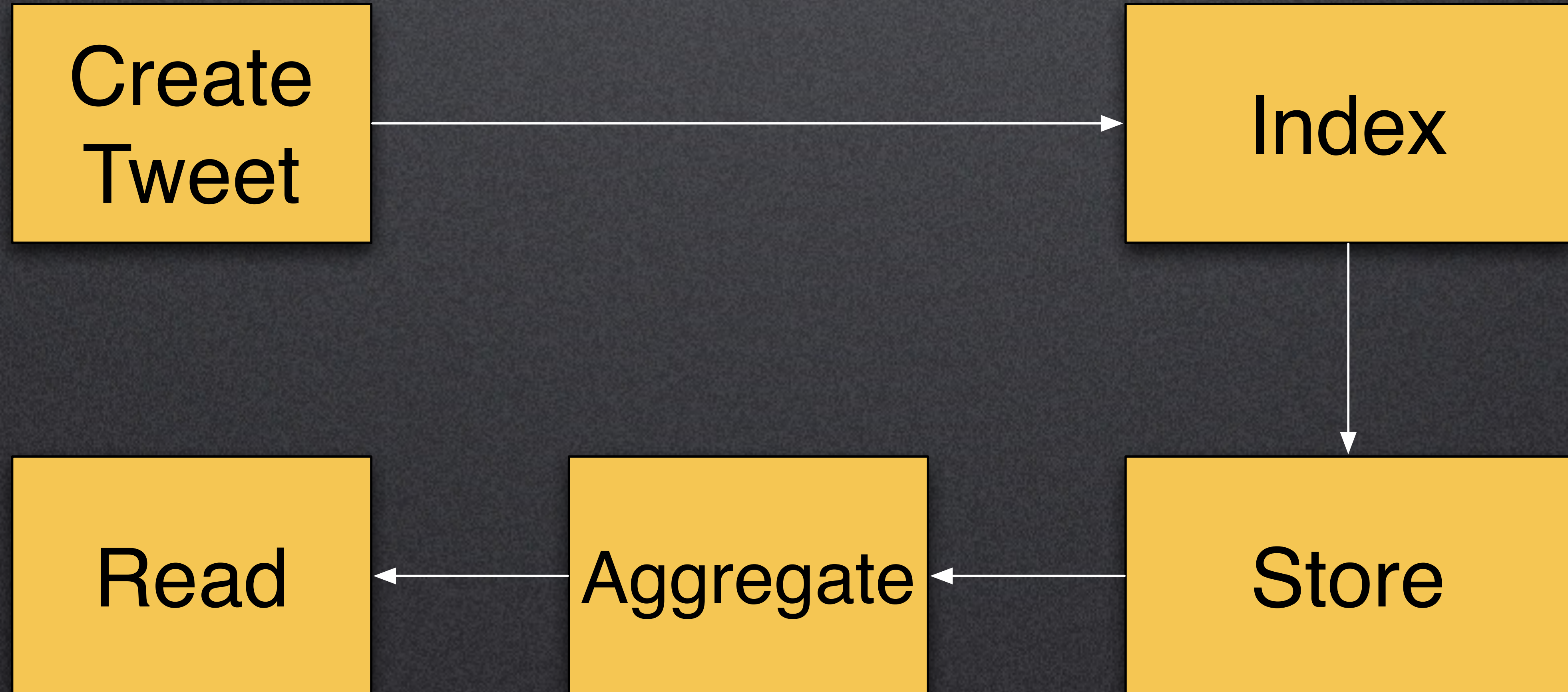
Tokenize



Write to
Lucene

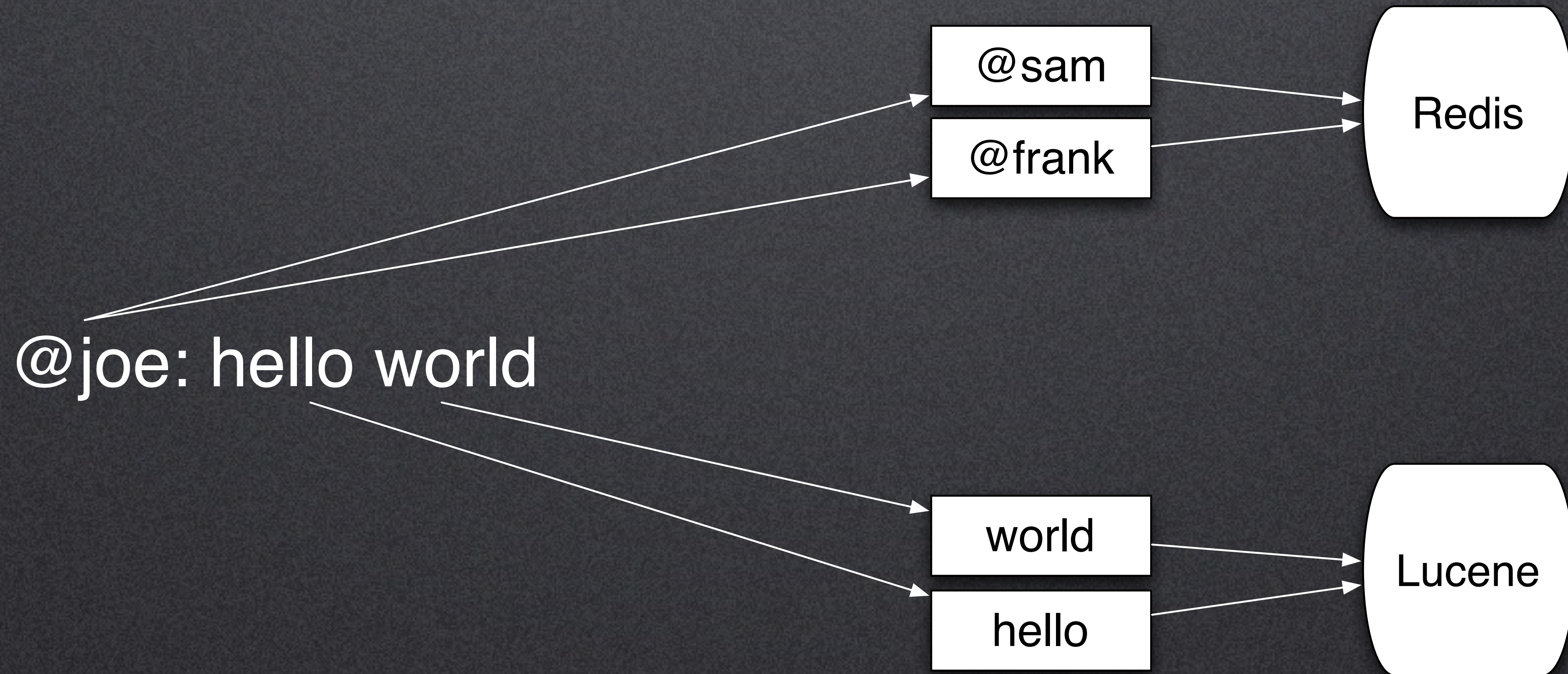


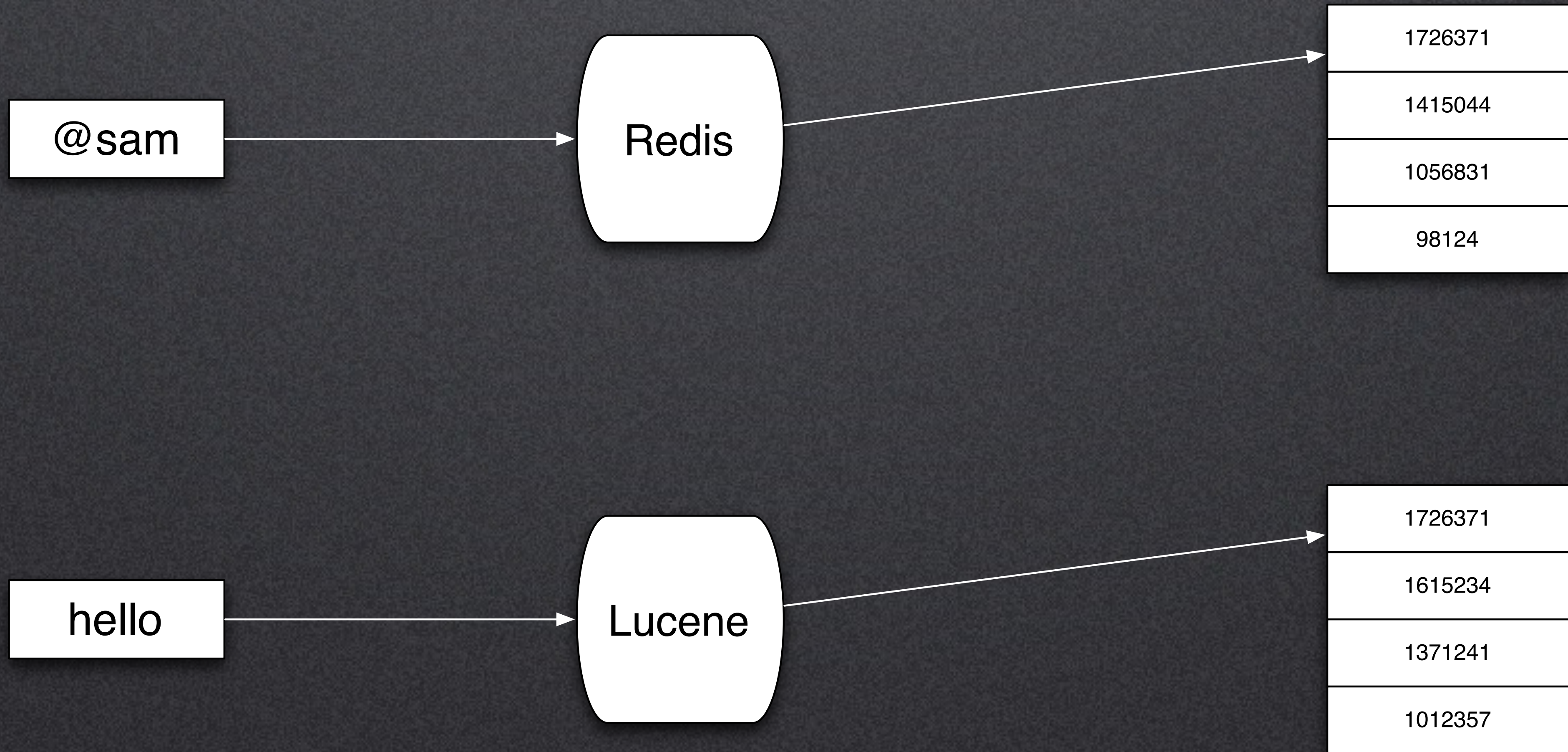




@joe tweets “hello world”
@joe followed by @sam and @frank

search index -> [“hello”, “world”]
fanout index -> [@sam, @frank]





User Intent

"QCon London"

@sam's
home timeline

User Intent

Query Expansion

"QCon London"



"QCon"
AND
"London"

@sam's
home timeline

User Intent

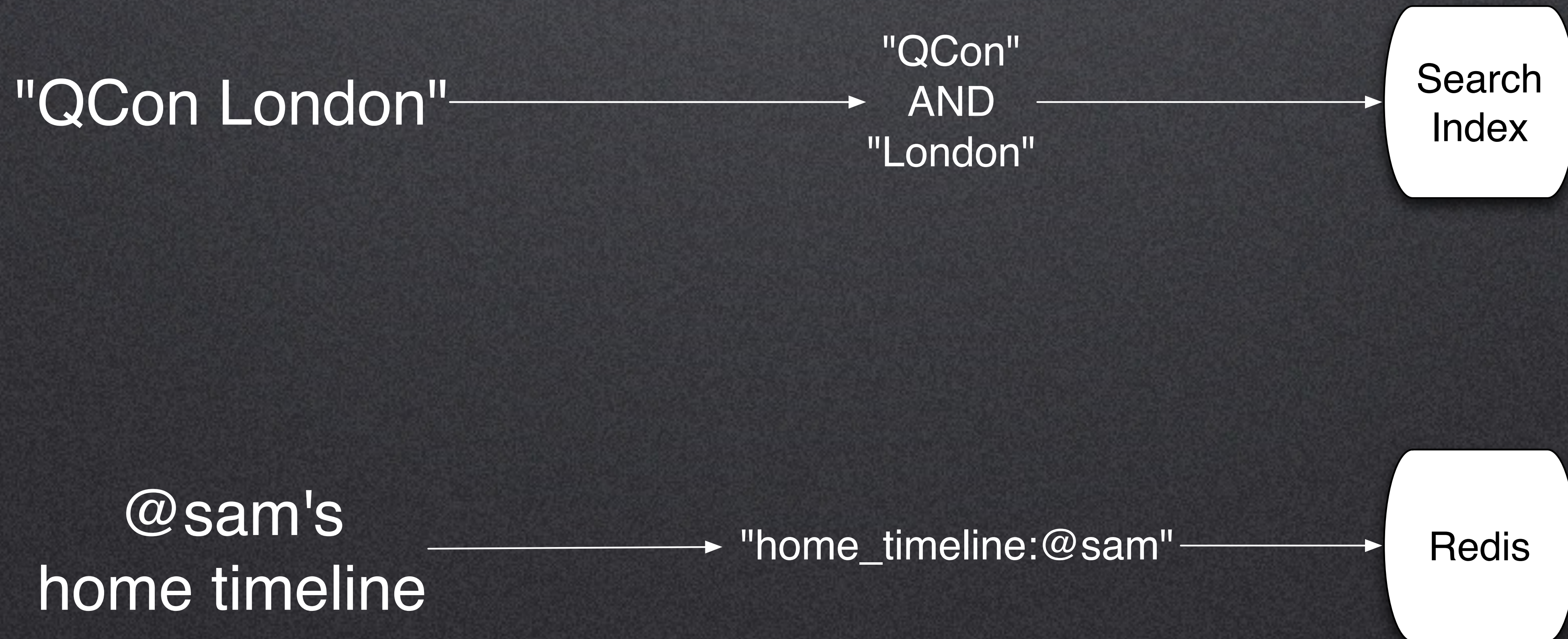
Query Expansion

"QCon London" → "QCon"
AND
"London"

@sam's
home timeline → "home_timeline:@sam"

User Intent

Query Expansion

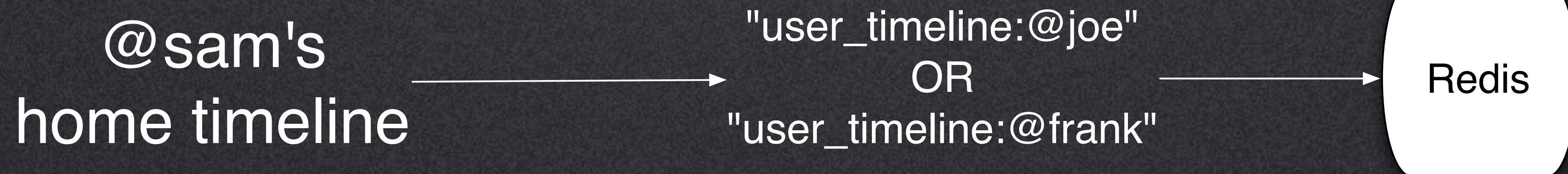


User Intent

Query Expansion



union of timelines



Fan-out vs Fan-in

Delivery Type	Read-time Cost	Write-time Cost
Fan-out		
Fan-in		
???		

Delivery Type	Read-time Cost	Write-time Cost
Fan-out	Low $O(1)$	
Fan-in		
???		

Delivery Type	Read-time Cost	Write-time Cost
Fan-out	Low $O(I)$	Low to High $O(N)$
Fan-in		
???		

Delivery Type	Read-time Cost	Write-time Cost
Fan-out	Low $O(I)$	Low to High $O(N)$
Fan-in	Low to High $O(N)$	
???		

Delivery Type	Read-time Cost	Write-time Cost
Fan-out	Low $O(I)$	Low to High $O(N)$
Fan-in	Low to High $O(N)$	Low $O(I)$
???		

Delivery Type	Read-time Cost	Write-time Cost
Fan-out	Low $O(I)$	Low to High $O(N)$
Fan-in	Low to High $O(N)$	Low $O(I)$
Hybrid		

Delivery Type	Read-time Cost	Write-time Cost
Fan-out	Low $O(I)$	Low to High $O(N)$
Fan-in	Low to High $O(N)$	Low $O(I)$
Hybrid	Low	

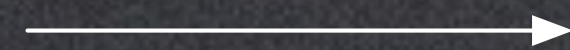
Delivery Type	Read-time Cost	Write-time Cost
Fan-out	Low $O(I)$	Low to High $O(N)$
Fan-in	Low to High $O(N)$	Low $O(I)$
Hybrid	Low	Low to Medium

@sam's
home timeline



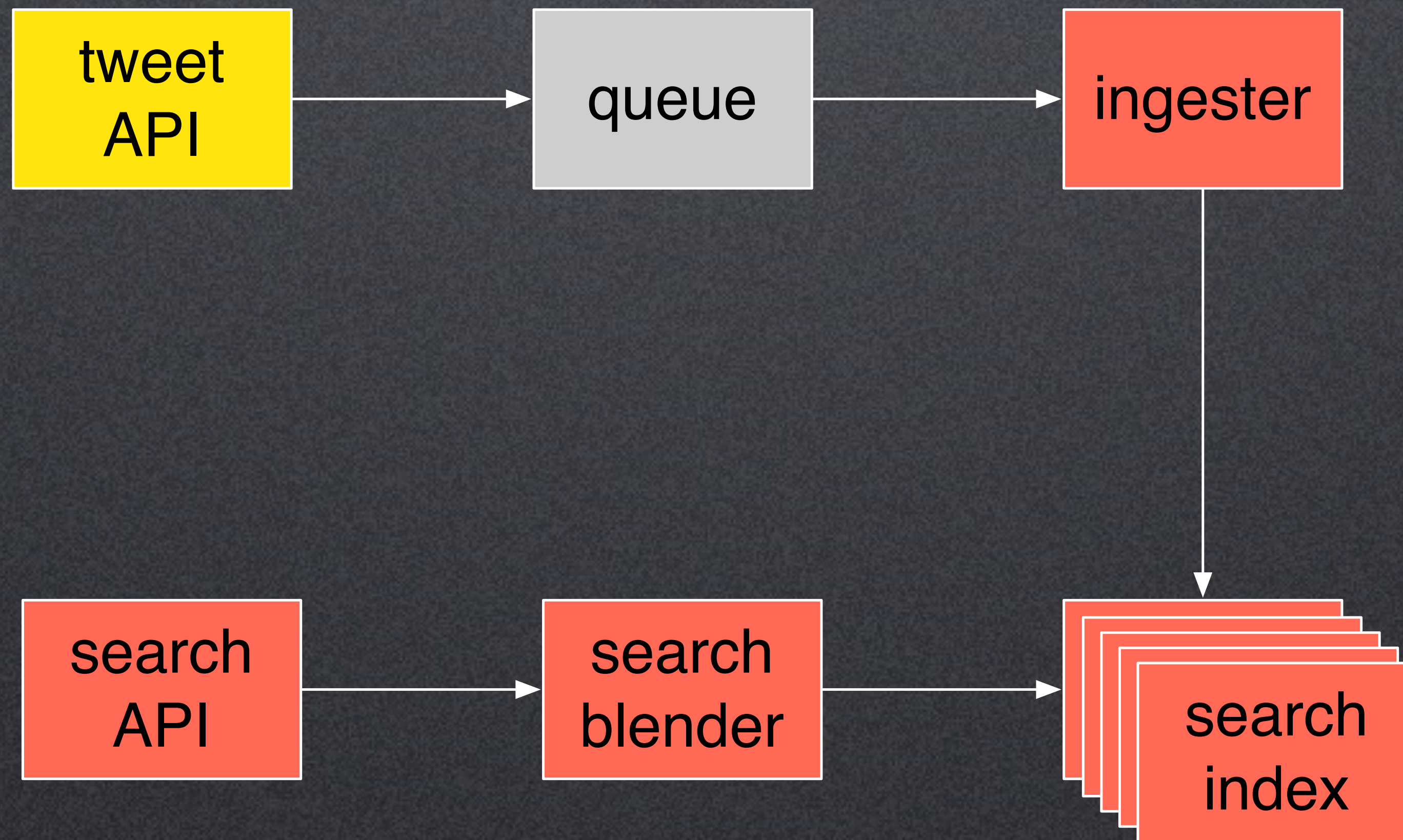
Redis

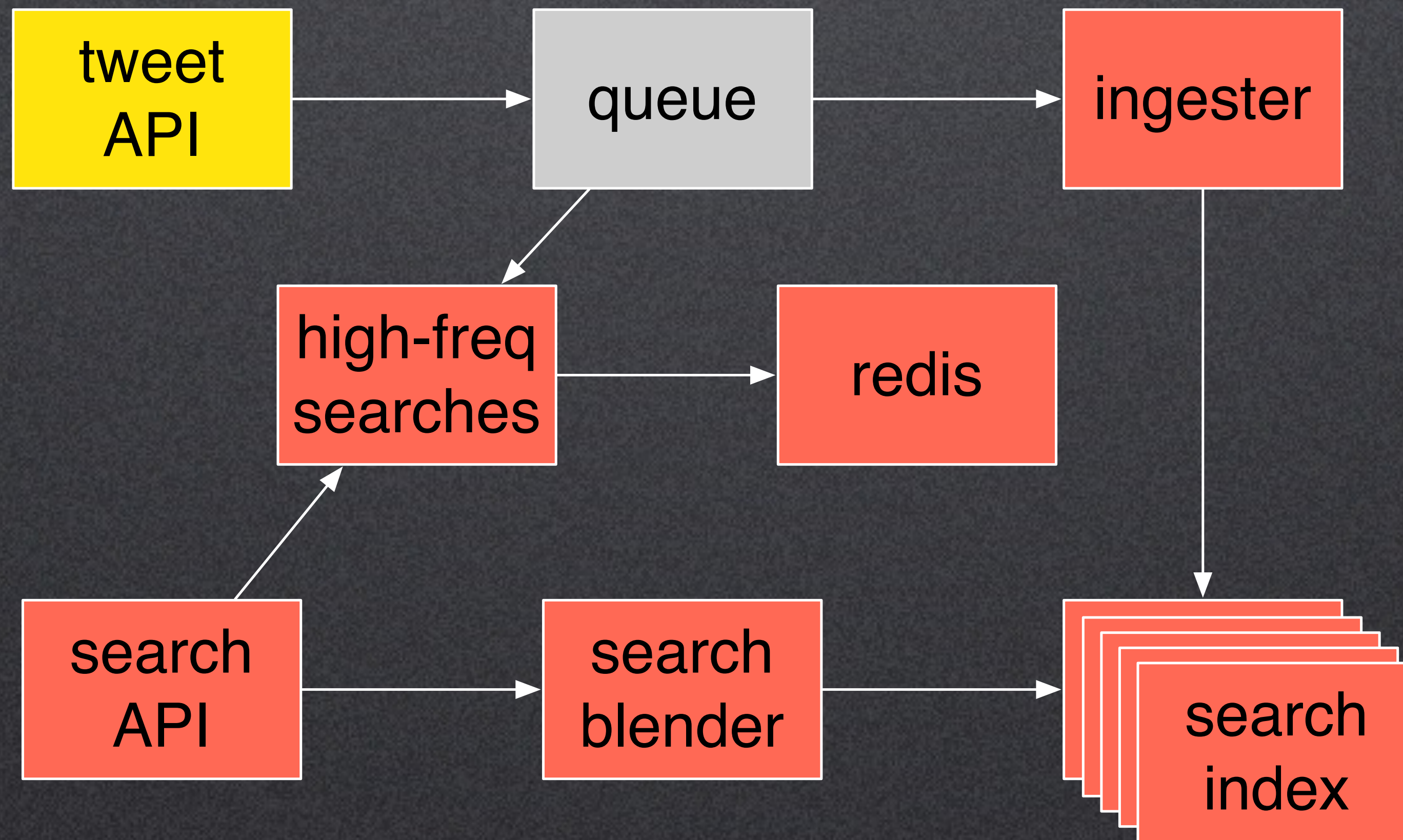
@sam's
home timeline



"home_timeline:@sam"
OR
"user_timeline:@barackobama"



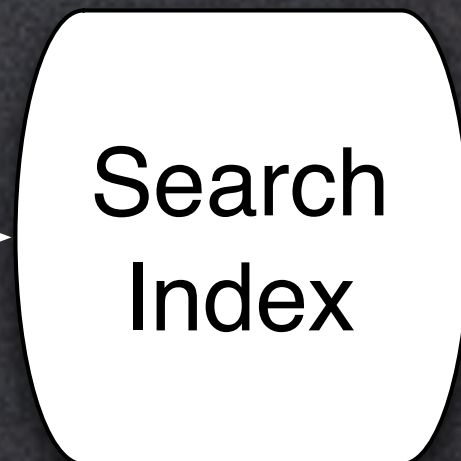




"Super Bowl"



"Super"
AND
"Bowl"



Search
Index

"Super Bowl"



"Super Bowl"



Redis

Redis vs Search Index

Redis Eviction Model

home_timeline:14653230



home_timeline:6014086



home_timeline:12512351



home_timeline:15123512



Redis Eviction Model

home_timeline:14653230

home_timeline:6014086

home_timeline:12512351

home_timeline:15123512



Redis Eviction Model

home_timeline:14653230



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Redis Eviction Model

home_timeline:14653230



home_timeline:6014086



home_timeline:12512351



home_timeline:15123512



Redis Eviction Model

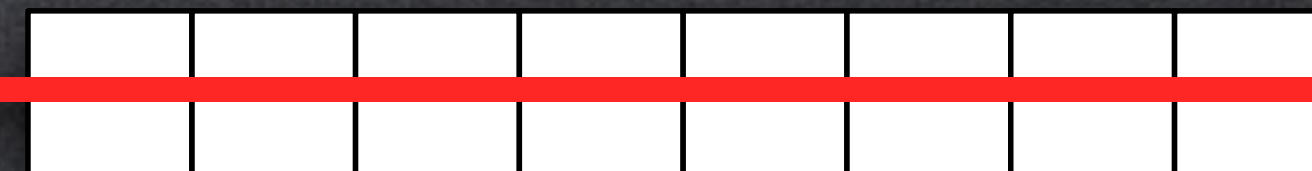
home_timeline:14653230



home_timeline:6014086



~~home_timeline:12512351~~



home_timeline:15123512



Redis Eviction Model

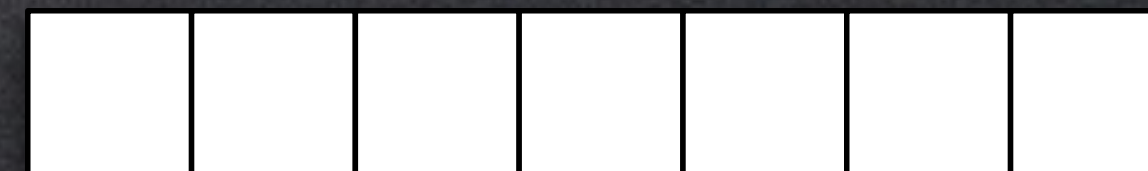
home_timeline:14653230



home_timeline:6014086



home_timeline:15123512



Search Index Eviction Model

QCon



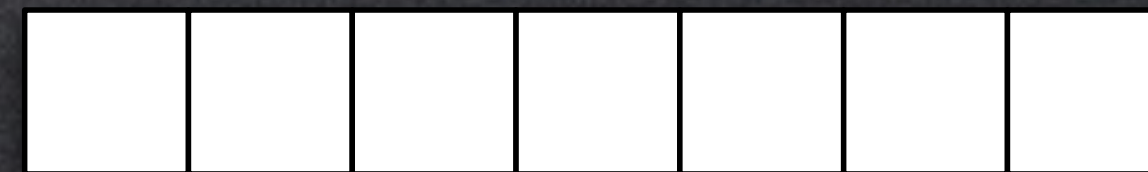
London



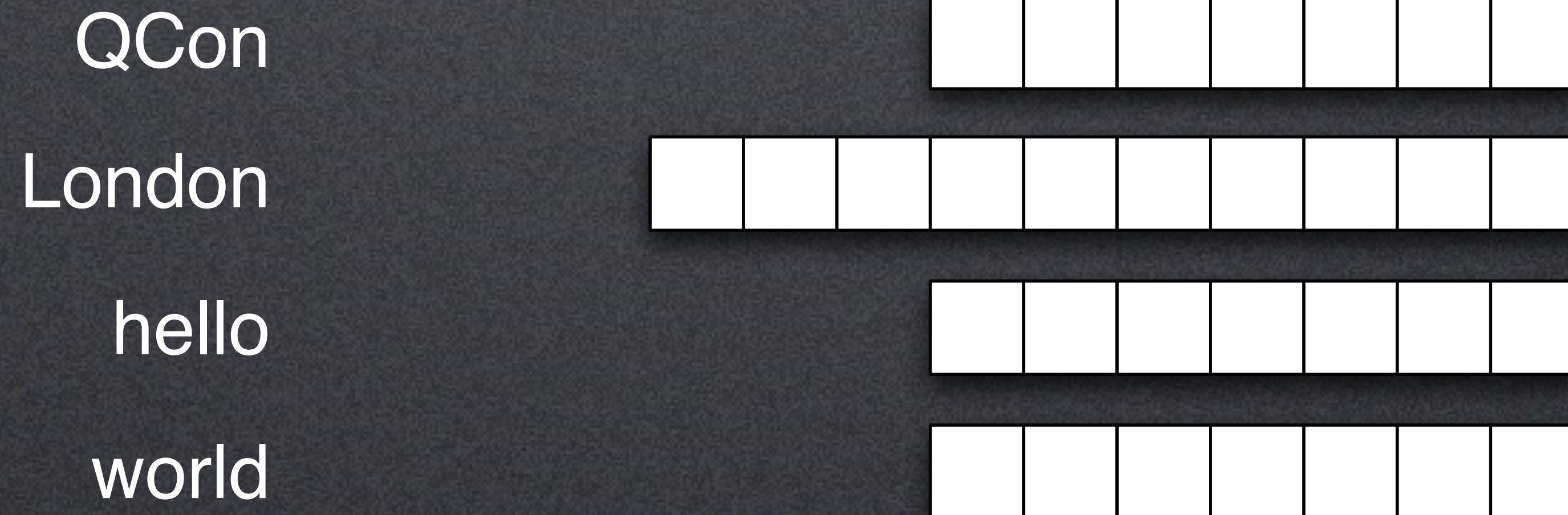
hello



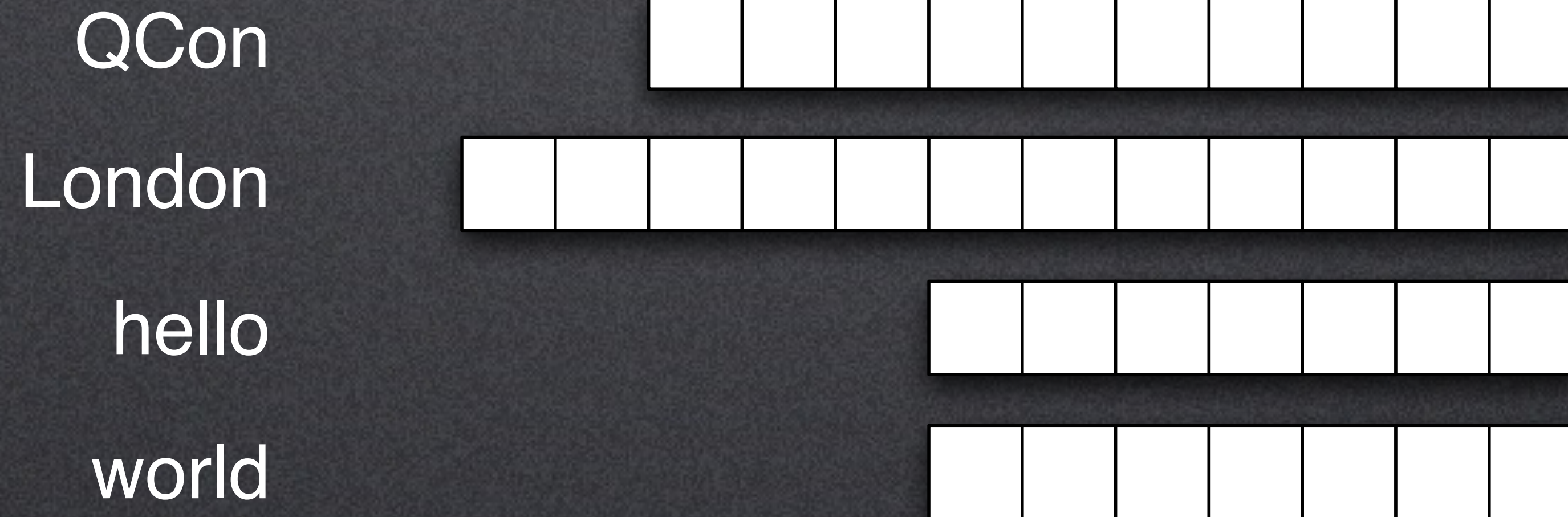
world



Search Index Eviction Model



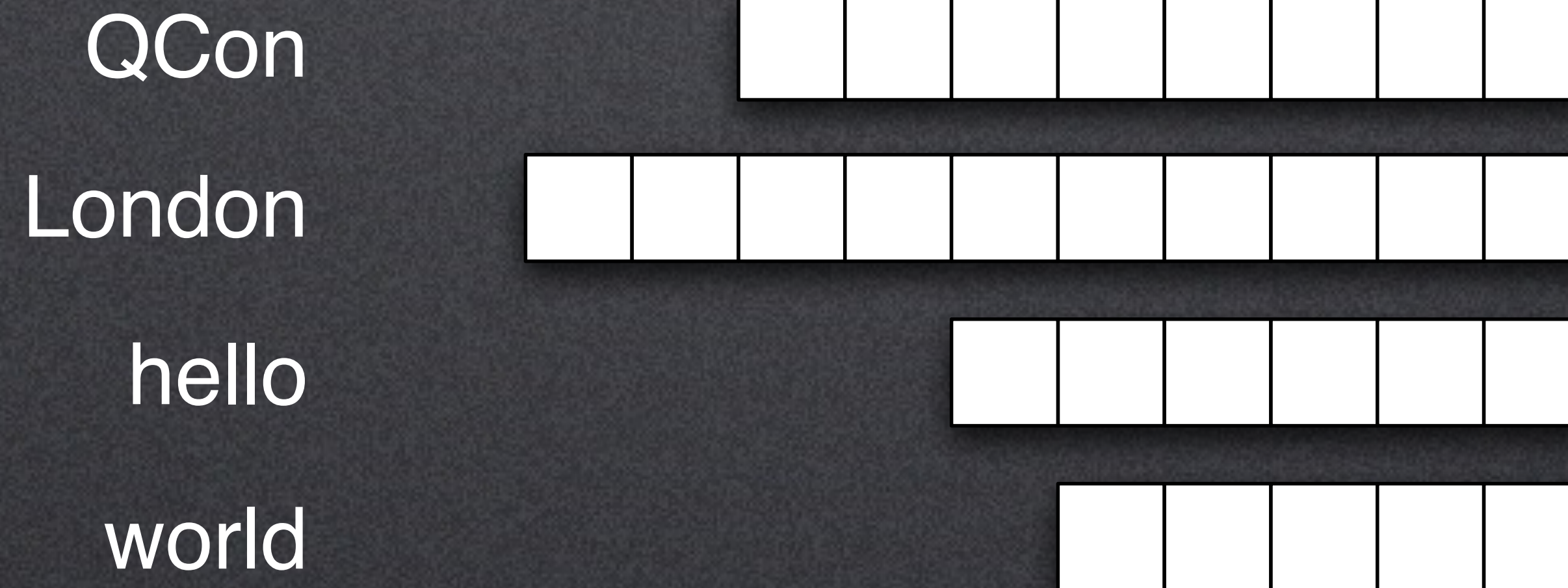
Search Index Eviction Model



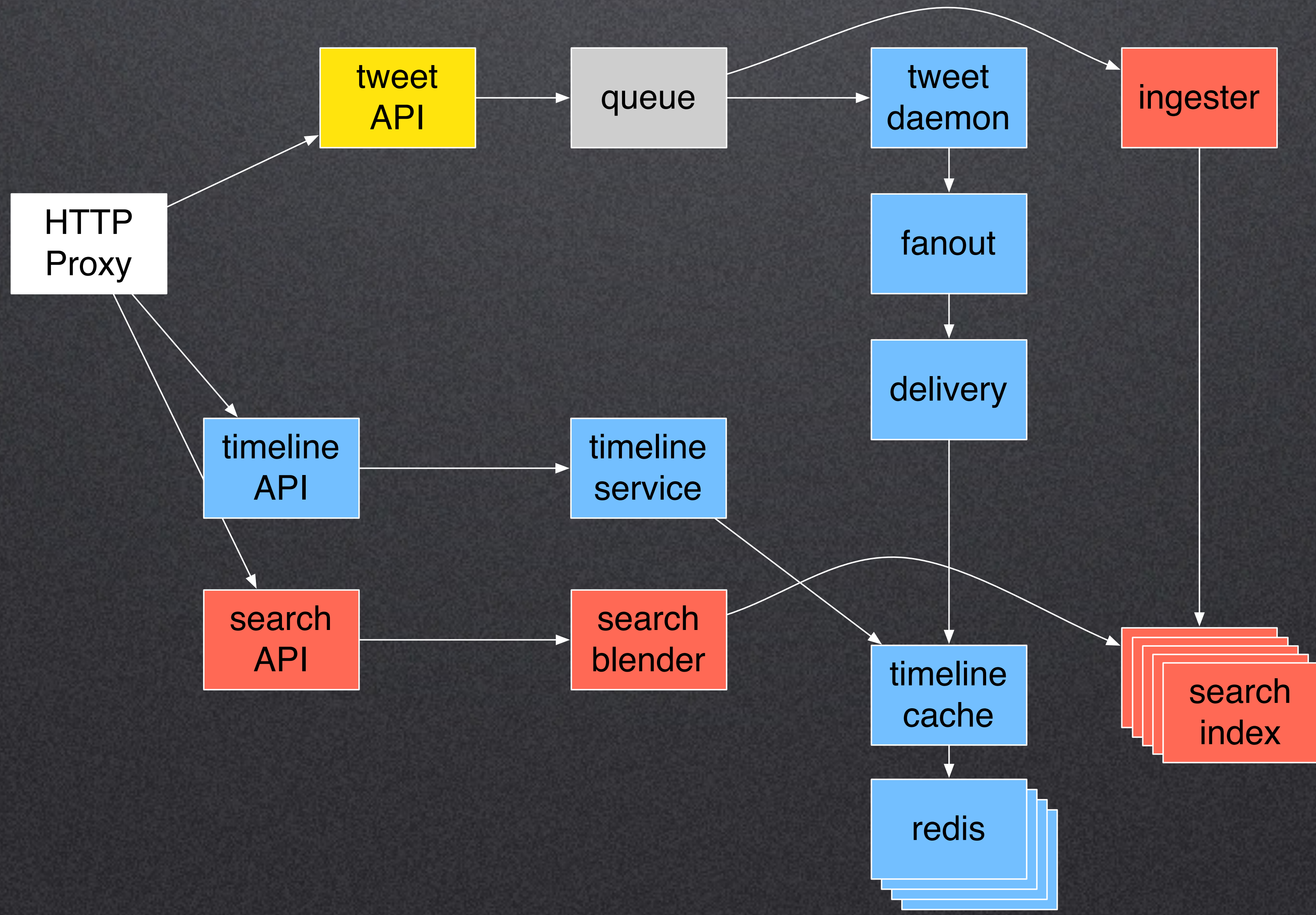
Search Index Eviction Model

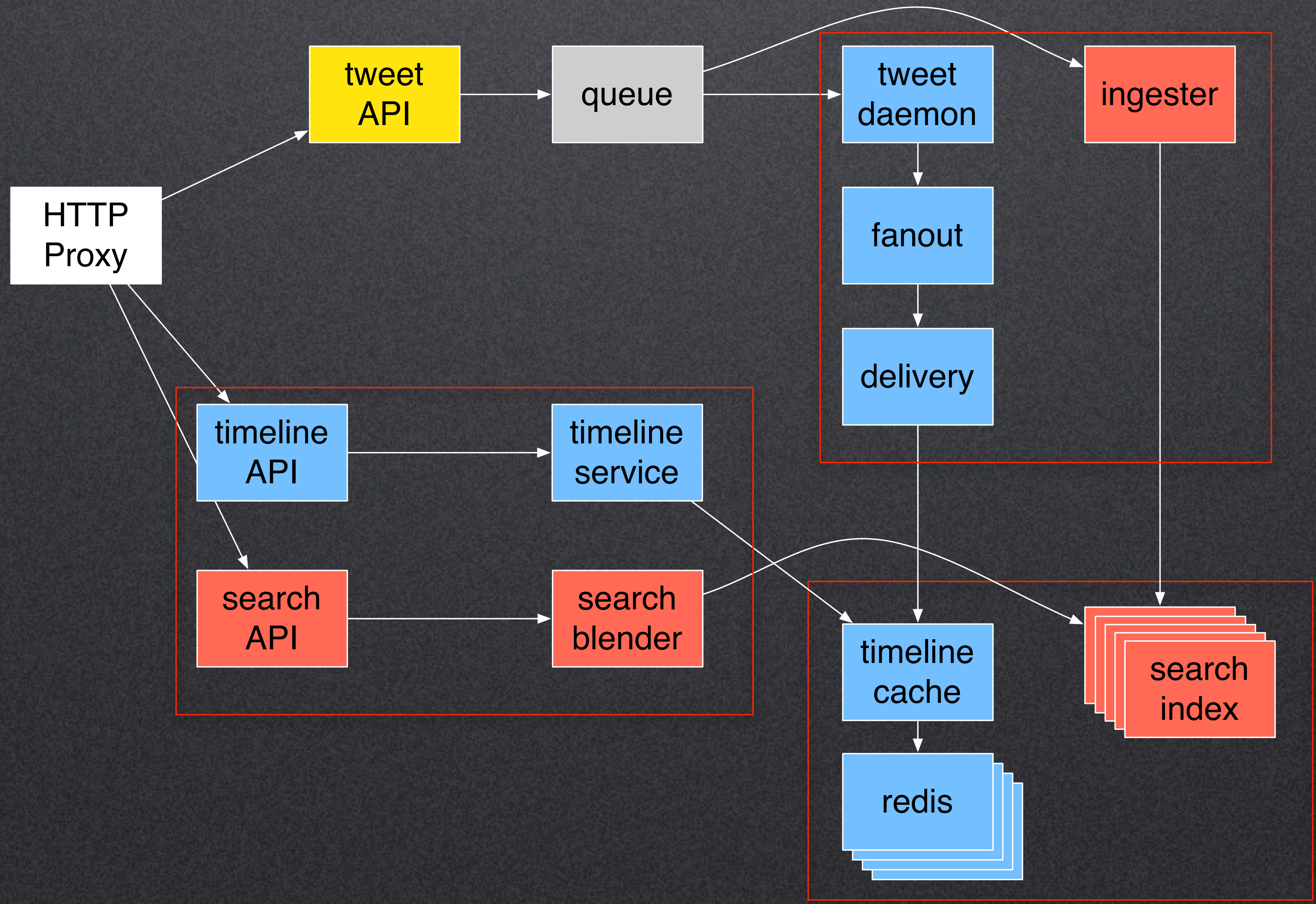


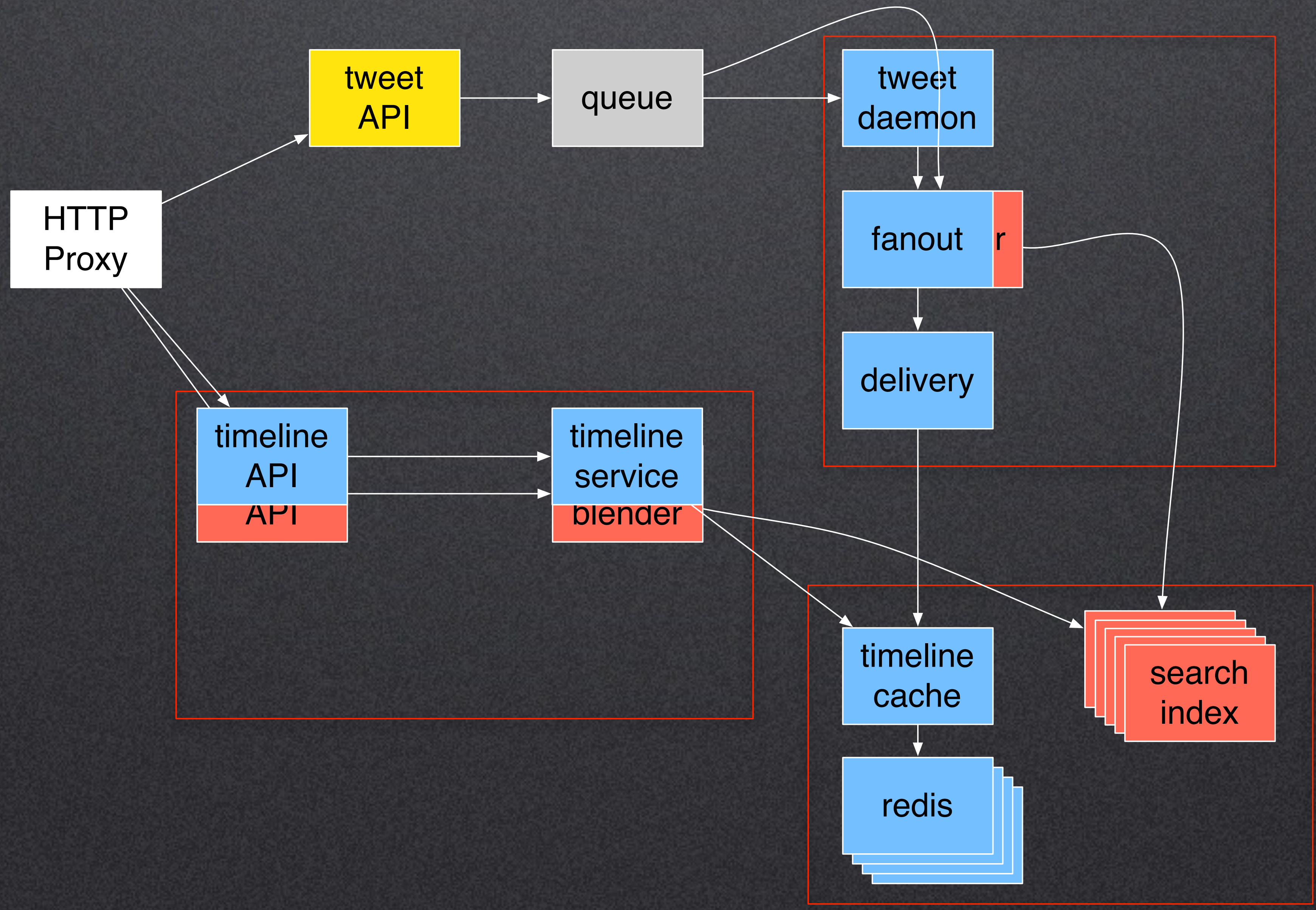
Search Index Eviction Model

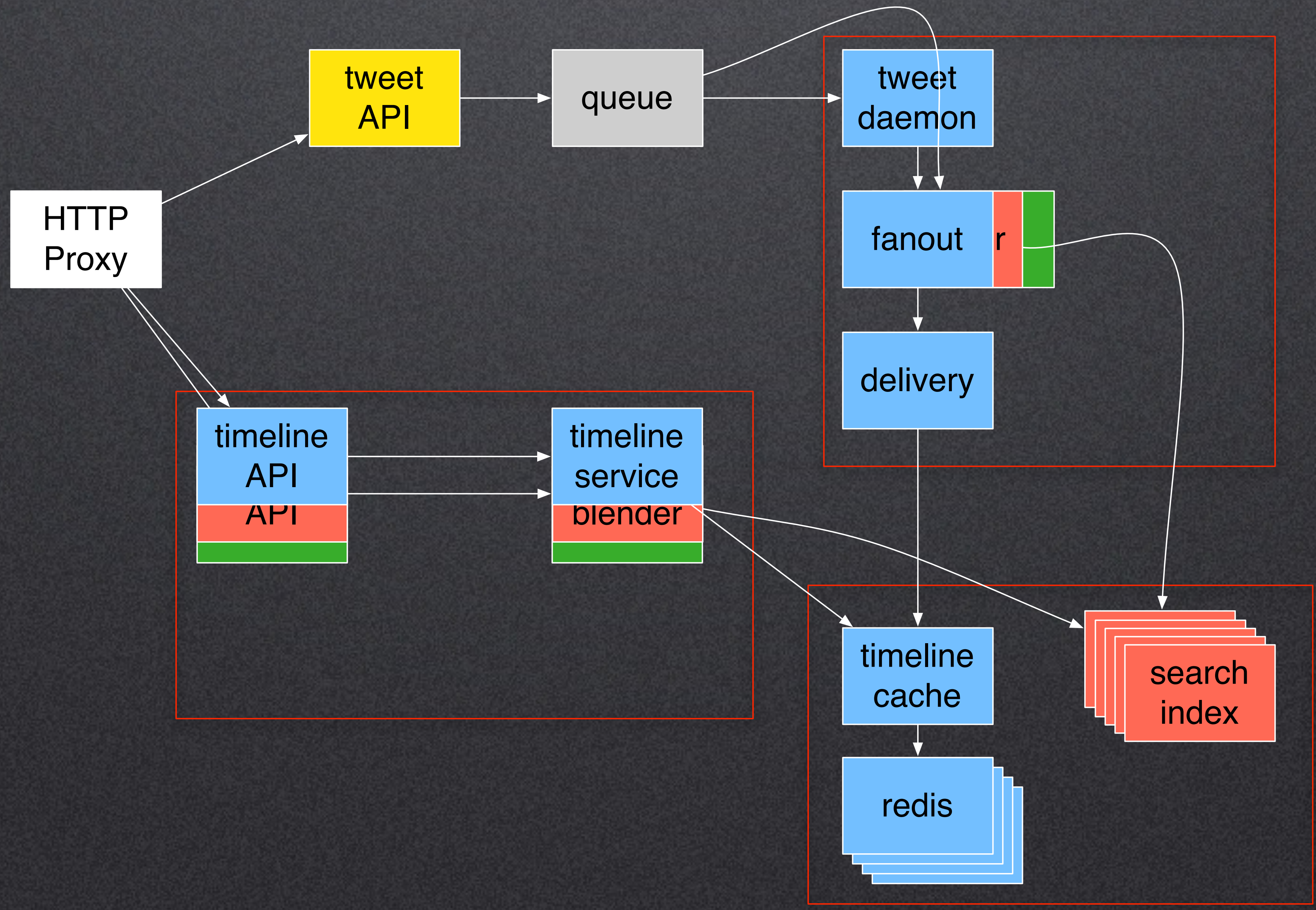


Conclusion









Questions?

Arya Asemanfar
@a_a