Service Level Objectives In Practice And At Scale

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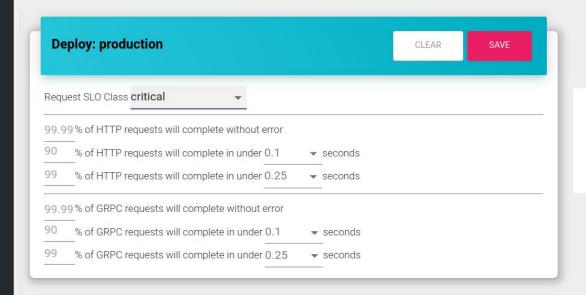
() @carsonoid



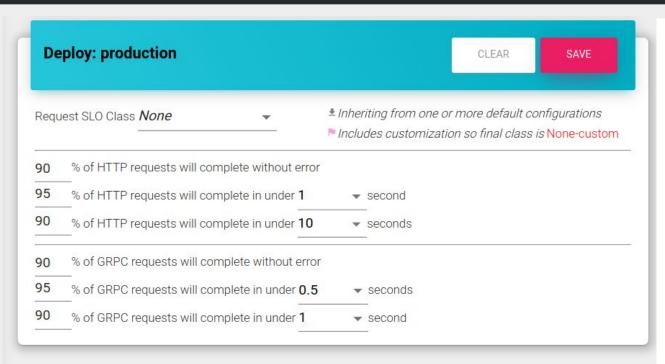
@carson_ops

SLOs at Weave

Simple, Pre-Defined Objectives

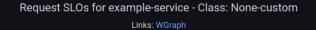


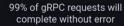
Fully Customized Objectives



```
deploy:
 2
       production:
         slo:
           requestSpec:
             grpc:
                availability:
                  percent: "90"
                latency:
 9
                  tier1:
10
                    percent: "90"
11
                    seconds: "1"
12
                  tier2:
                    percent: "95"
13
                    seconds: "0.5"
14
15
             http:
                availability:
16
17
                  percent: "90"
18
                latency:
19
                  tier1:
                    percent: "90"
20
21
                    seconds: "10"
22
                  tier2:
23
                    percent: "95"
                    seconds: "1"
24
25
```

Generated Dashboards









99% of gRPC requests will complete in under 2.5 second(s)





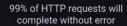
90% of gRPC requests will complete in under 5 second(s)



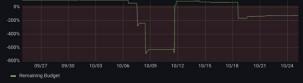


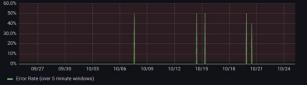


Generated Dashboards - Pt. 2









99% of HTTP requests will complete in under 2.5 second(s)







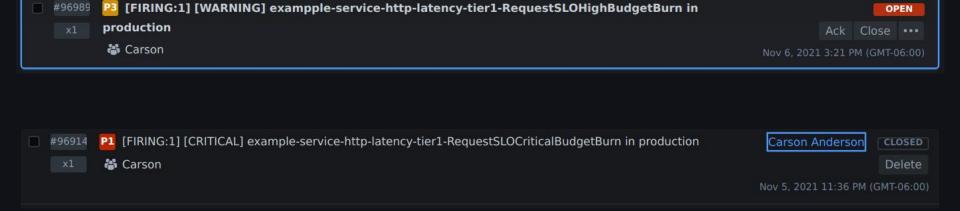
90% of HTTP requests will complete in under 5 second(s)







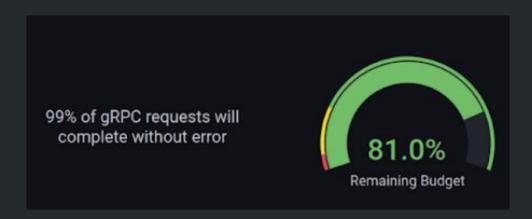
Generated Alerts



So How Do I Get There?

- Calculating budgets
- Creating great alerts
- Handle scale
- Handle cost

Calculating An SLO Budget The Math



How to calculate an SLO

- Decide on an SLO window
 - Google SRE book: 30d
 - Weave: 28d (4 weeks)
- Calculate the number of objective "fails" allowed
 - Availability failure == response returns a server-side error
 - Ex: 500
 - Latency failure == response time < objective time
 - Ex: 2 seconds to respond
- Calculate the final budget % remaining
 - Based on total & budged

Calculating Budgeted Errors

50*.1=5

Calculating the SLO %

$$\frac{\text{Budgeted - Actual}}{\text{Budgeted}} = \frac{\text{Budget}}{\text{Budgeted}}$$

$$\frac{5 - 0}{5} = 100\%$$

Basic SLO Budget Calculations

Tota * .1 = Budgeted

1- (Objective/100)
Ex: 1- (90/100)

Budgeted - Actual __Budget

Budgeted

Budgeted: 5 = Total: 50 * .1

$$\frac{5-0}{5} = 100\%$$

+1 Bad Request

Budgeted: 5 Total: 51 * .1

$$100\% = \frac{5 - 0}{5} | 80\% = \frac{5 - 1}{5}$$

+3 Bad Requests

Budgeted: 5 = Total: 54 * .1

$$80\% = \frac{5-1}{5} | 20\% = \frac{5-4}{5}$$

+1 **Good** Request

Budgeted: 5 = Total: 55 * .1

$$20\% = \frac{5 - 4}{5} \quad 20\% = \frac{5 - 4}{5}$$

+5 **Good** Requests

Budgeted: 6 = Total: 60 * .1

$$20\% = \frac{5 - 4}{5} \quad 33\% = \frac{6 - 4}{6}$$

Recover With Time

28d

Recover With Time

28d

$$\frac{2-4}{2} = -100\%$$

Recover With Time

28d

$$-100\% = \frac{2-4}{2} \quad 0\% = \frac{2-2}{2}$$

Key Takeaways

- Budgets can burn FAST
- Two ways to recover:
 - Time
 - Handle more "Good" request, a lot of them

Prometheus Specifics

Availability SLO Recording Rules

Prometheus Metric Crash-Course - counters

```
# HELP http_timer_count The total number of HTTP requests.
# TYPE http_timer_count counter
http_timer_count{app="api", code="200", method="GET"} 1
http_timer_count{app="api", code="200", method="POST"} 10
http_timer_count{app="api", code="200", method="PATCH"} 2
http_timer_count{app="frontend", code="200", method="GET"} 110
http_timer_count{app="frontend", code="404", method="GET"} 23
http_timer_count{app="frontend", code="500", method="GET"} 2
```

```
# HELP http_timer_bucket A histogram of request duration
# TYPE http_timer_bucket histogram
http_timer_bucket{app="api", code="200", method="GET", le="+Inf"}
...
```

New Requests

• 1s latency

Bucket Increments

le:
$$.25 =$$

le:
$$1 = X$$

le:
$$5 = X$$

$$le: +Inf = X$$

New Requests

- 1s latency
- 5s latency

Bucket Increments

```
le: .1 =
```

le:
$$.25 =$$

le:
$$1 = X$$

le:
$$5 = XX$$

$$le: +Inf = XX$$

New Requests

- 1s latency
- 5s latency
- .1s latency

Bucket Increments

```
le: .1 = X
```

le: .25 = X

le: 1 = XX

le: 5 = XXX

le: +Inf = XXX

Prometheus Counter Reminder

```
# HELP http_timer_count The total number of HTTP requests.
# TYPE http_timer_count counter
http_timer_count{app="api", code="200", method="GET"} 1
http_timer_count{app="api", code="200", method="POST"} 10
http_timer_count{app="api", code="200", method="PATCH"} 2
http_timer_count{app="frontend", code="200", method="GET"} 110
http_timer_count{app="frontend", code="404", method="GET"} 23
http_timer_count{app="frontend", code="500", method="GET"} 2
```

Prometheus Metric Crash-Course - histograms

```
# HELP http timer bucket A histogram of request duration
# TYPE http timer bucket histogram
http timer bucket{app="api", code="200", method="GET", l e="+Inf"} 1
http timer bucket{app="api", code="200", method="GET", l e="5"} 1
http timer bucket{app="api", code="200", method="POST", le="+Inf"} 10
http timer bucket{app="api", code="200", method="POST", le="5"} 7
http timer bucket{app="api", code="200", method="POST", le="1"} 5
http timer bucket{app="api", code="200", method="POST", le=".25"} 5
http timer bucket{app="api", code="200", method="POST", le=".1"} 5
http timer bucket{app="api", code="200", method="PATCH", l e="+Inf"} 2
http timer bucket{app="frontend", code="200", method="GET", le="+Inf"} 110
http timer bucket{app="frontend", code="200", method="GET", le="5"} 101
http timer bucket{app="frontend", code="200", method="GET", le="1"} 100
http timer bucket{app="frontend", code="200", method="GET", le=".25"} 97
http timer bucket{app="frontend", code="200", method="GET", le=".1"} 96
http timer bucket{app="frontend", code="404", method="GET", le="+Inf"} 23
```

FYI there is some duplication

```
# sum all variants of the count
sum(http_timer_count{app="frontend"}) = 135
# sum all variants of the catch-all bucket
sum(http_timer_bucket{app="frontend", le="+Inf"}) = 135
# some tooling sets a dedicated "bucket_count" metric
http timer bucket count{app="frontend"} = 135
```

Which Metrics to use?

```
grpc_timer_count & http_timer_count
```

• total count of requests

```
grpc_timer_bucket & http_timer_bucket
```

histogram of requests, bucketed by time

```
grpc_timer_bucket_count & http_timer_bucket_count
```

• total number of requests through histogram

Key Takeaways

- Histograms in Prometheus are cumulative
 - ALL requests will always get counted in "+Inf"
- Weave tooling: `http_timer_bucket` has everything
 - No need for any `*_count` metrics
 - Can dramatically cut total # of series in

grpc_timer_bucket{"+Inf"} == grpc_timer_count



Availability SLO Recording Rules

... The Easy Way

Instantaneous Error Budget Rule For All Apps

```
sum(http timer bucket{le="+Inf"}) by (app) * .1 )
    sum(http timer bucket{le="+Inf"}) by (app) )
    sum(http timer bucket{le="+Inf",code!~"5.."}) by (app) )
sum (http timer bucket{le="+Inf"}) by (app) * .1 )
```

28d Error Budget Rule For All Apps

```
( sum(increase(http_timer_bucket{le="+Inf"}[28d])) by (app) * .1 )
-
   (
    ( sum(increase(http_timer_bucket{le="+Inf"}[28d])) by (app) )
   -
    ( sum(increase(http_timer_bucket{le="+Inf",code!~"5.."}[28d])) by (app) )
)
)
( sum(increase(http_timer_bucket{le="+Inf"}[28d])) by (app) * .1 )
```

Lots of Duplication, Compute, Confusion

Important Prometheus Recording Behavior!

- Prometheus supports Rules
 - alert rules used to create alerts (duh)
 - record rules run queries and save results
- Rules are provided in groups
- Rules are evaluated periodically
- Groups are processed in a random order
- Rules within a group are always processed in order

Example Availability Prometheus Rules



```
groups:
  - name: slo:example: budget all in one
    rules:
    - record: slo:total
      expr: sum(increase(http timer bucket{le="+Inf"}[28d])) by (app)
    - record: slo:budgeted
      expr: slo:total * .1
    - record: slo:occured
      expr:
        slo:total -
        sum(increase(http timer bucket{le="+Inf",code!~"5.."}[28d])) by (app)
    - record: slo:budget
      expr: (slo:budgeted - slo:occured) / slo:budgeted
```

Old rule for comparison

```
(
  ( sum(increase(http_timer_bucket{le="+Inf"}[28d])) by (app) * .1 )
  -
  (
    ( sum(increase(http_timer_bucket{le="+Inf"}[28d])) by (app) )
  -
    ( sum(increase(http_timer_bucket{le="+Inf",code!~"5.."}[28d])) by (app) )
)
)
( sum(increase(http_timer_bucket{le="+Inf"}[28d])) by (app) * .1 )
```

There are still problems!

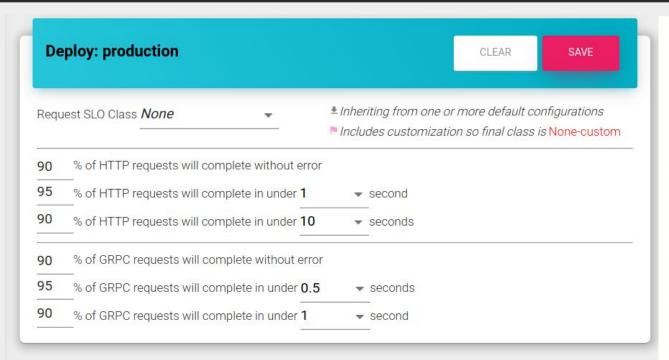
Problems With All-In-One Rules

- All Apps have to have the same SLO objective
- Calculations for long SLO periods can be too large for Prometheus to calculate
 - "error executing query: query processing would load too many samples into memory in query execution"

Real, Auto-Generated

Availability SLO Recording Rules

Remember This?



```
deploy:
       production:
 2
         slo:
           requestSpec:
              grpc:
                availability:
                  percent: "90"
                latency:
 9
                  tier1:
                    percent: "90"
10
11
                    seconds: "1"
12
                  tier2:
                    percent: "95"
13
                    seconds: "0.5"
14
15
              http:
                availability:
16
17
                  percent: "90"
18
                latency:
19
                  tier1:
                    percent: "90"
20
21
                    seconds: "10"
22
                  tier2:
                    percent: "95"
23
24
                    seconds: "1"
25
```

Calculate the Total # of requests for the budget

```
- record: 'slo:example_service:request:http:availability:budget_total
  expr: |
    sum(increase(http_timer_bucket{app="example-service",le="+Inf"}[28d]))
```

Calculate the total # of requests allowed to fail

```
- record: 'slo:example_service:request:http:availability:budget_allowed'
expr: |
    (slo:example_service:request:http:availability:tier1:budget_total * .01)
```

Objective: "99% Must Not Fail"

Calculate the total # of requests to actually fail

```
- record: 'slo:example_service:request:http:availability:budget_violations'
expr: >
    (slo:example_service:request:http:availability:tier1:budget_total -
    sum(increase(
         http_timer_bucket{app="example-service",code!~"5..",le="+Inf"}[28d]
    ))
    )
}
```

Budget = Budgeted - Actual Budgeted

Calculate Remaining Budget

```
# Calculate budget as: Budgeted - Actual / Budgeted
- record: 'slo:example_service:request:http:availability:error_budget'
expr: >
    (
        slo:example_service:request:http:availability:budget_allowed -
        slo:example_service:request:http:availability:budget_violations
) /
    slo:example_service:request:http:availability:budget_allowed
```

Budget = Budgeted - Actual Budgeted

Final Rules - Availability

```
# Calculate the Total # of requests within a timeframe that count towards the budget
- record: 'slo:example service:request:http:availability:budget total'
  expr: |
    sum(increase(http timer bucket{app="example-service",le="+Inf"}[28d]))
# Calculate the total # of requests within a timeframeBudgeted to fail
- record: 'slo:example service:request:http:availability:budget allowed'
  expr:
    (slo:example service:request:http:availability:budget total * .01)
# Calculate the total # of requests within a timeframe that Actually failed
- record: 'slo:example service:request:http:availability:budget violations'
  expr: >
    (slo:example service:request:http:availability:budget total -
    sum(increase(http timer bucket{app="example-service",code!~"5..",le="+Inf"}[28d])))
# Calculate budget as: Budgeted - Actual / Budgeted
- record: 'slo:example service:request:http:availability:error budget'
  expr: >
    (slo:example_service:request:http:availability:budget allowed -
    slo:example service:request:http:availability:budget violations) /
    slo:example_service:request:http:availability:budget allowed
```

Real Latency SLO Recording Rules



Final Rules - Latency

```
# Calculate the Total # of requests within a timeframe that count toward Change rule names
- record: 'slo:example service:request:http:latency:tier1:budge
 expr: |
                                                                           Weave has two "tiers" of
   sum(increase(http timer bucket{app="example-service",le="+Inf"}[28d]))
                                                                           latency:
                                                                             • tier 1 = stretch goal
# Calculate the total # of requests within a timeframeBudgeted to fail
                                                                             • tier 2 = required
- record: 'slo:example service:request:http:latency:tier1:budget allowed'
 expr:
    99% must complete...
# Calculate the total # of requests within a timeframe that Actually failed
- record: 'slo:example service:request:http:latency:tier1:budget violations'
 expr: >
                                                                              ...in 1 second or less
    (slo:example service:request:http:latency:tier1:budget total -
   sum(increase(http timer bucket{app="example-service",le="1"};zou;;;;)
# Calculate budget as: Budgeted - Actual / Budgeted
- record: 'slo:example service:request:http:latency:tier1:error budget' # <- The actual budget
 expr: >
    (slo:example_service:request:http:latency:tier1:budget allowed -
   slo:example service:request:http:latency:tier1:budget violations) /
   slo:example service:request:http:latency:tier1:budget allowed
```

Dashboard Queries Get To Be Simple!



99% of HTTP requests will complete without error

99% of HTTP requests will complete in under 2.5 second(s)

90% of HTTP requests will complete in under 5 second(s)

SLO Alerting

Naive SLO Alert

```
- alert: example_service:LowHTTPAvailabilityBudget
  expr: |
    slo:example_service:request:http:availability:error budget < .5</pre>
```

Alert Periods





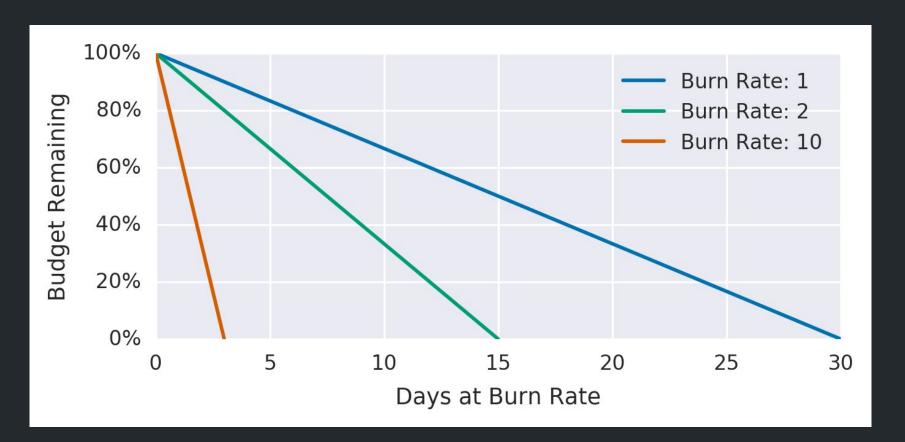
Goal: Detect Fast Drops of High %



Goal: Detect Slow Burn Over Time



Great Alerts Use "Burn Rate"



Calculate A Burn Rate

error_rate burn_rate request_rate

Calculate A Burn Rate In Prometheus

request_rate-good_rate burn_rate

Availability Burn Rate Recording Rule 5m Example

Availability Burn Rate Recording Rules

```
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[5m])) -
    sum(rate(http timer bucket{app="example-app",code!~"5..",le="+Inf"}[5m])))
    / sum(rate(http timer bucket{app="example-app",le="+Inf"}[5m]))
  record: 'slo:example app:request:http:availability:rate 5m'
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[30m])) -
    sum(rate(http timer bucket{app="example-app",code!~"5..",le="+Inf"}[30m])))
    / sum(rate(http timer bucket{app="example-app",le="+Inf"}[30m]))
  record: 'slo:example app:request:http:availability:rate 30m'
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[1h])) -
    sum(rate(http timer bucket{app="example-app",code!~"5..",le="+Inf"}[1h])))
    / sum(rate(http timer bucket{app="example-app",le="+Inf"}[1h]))
  record: 'slo:example app:request:http:availability:rate 1h'
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[6h])) -
    sum(rate(http timer bucket{app="example-app",code!~"5..",le="+Inf"}[6h])))
    / sum(rate(http timer bucket{app="example-app",le="+Inf"}[6h]))
  record: 'slo:example app:request:http:availability:rate 6h'
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[3d])) -
    sum(rate(http timer bucket{app="example-app",code!~"5..",le="+Inf"}[3d])))
    / sum(rate(http timer bucket{app="example-app",le="+Inf"}[3d]))
  record: 'slo:example app:request:http:availability:rate 3d'
```

Latency Burn Rate Recording Rule 5m Example

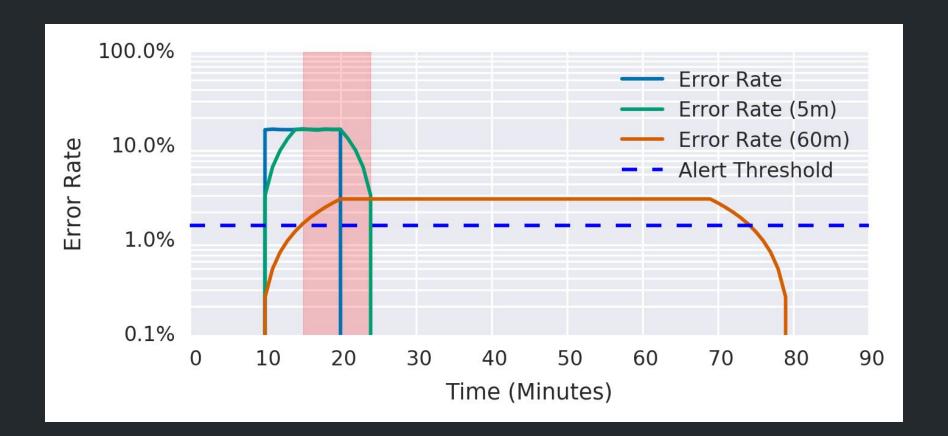
```
- expr: |
    (
        sum(rate(http_timer_bucket{app="example-app",le="+Inf"}[5m]))
        -
        sum(rate(http_timer_bucket{app="example-app",le="5",le="5",le")
        /
        sum(rate(http_timer_bucket{app="example-app",le="+Inf"}[5m]))
        record: 'slo:example_app:request:http:latency:tier1:rate_5m'
```

Latency Burn Rate Recording Rules

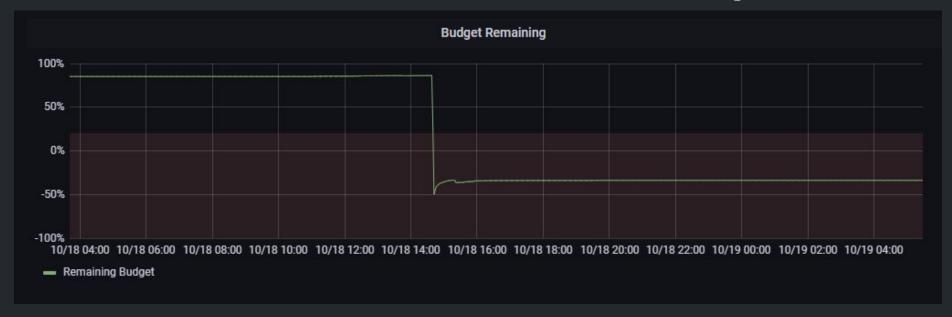
```
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[5m])) -
    sum(rate(http timer bucket{app="example-app",le="5"}[5m]))) /
    sum(rate(http timer bucket{app="example-app",le="+Inf"}[5m]))
  record: 'slo:example app:request:http:latency:tier1:rate 5m'
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[30m])) -
    sum(rate(http timer bucket{app="example-app",le="5"}[30m]))) /
    sum(rate(http timer bucket{app="example-app",le="+Inf"}[30m]))
  record: 'slo:example app:request:http:latency:tier1:rate 30m'
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[1h])) -
    sum(rate(http timer bucket{app="example-app",le="5"}[1h]))) /
    sum(rate(http timer bucket{app="example-app",le="+Inf"}[1h]))
  record: 'slo:example app:request:http:latency:tier1:rate 1h'
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[6h])) -
    sum(rate(http timer bucket{app="example-app",le="5"}[6h]))) /
    sum(rate(http timer bucket{app="example-app",le="+Inf"}[6h]))
  record: 'slo:example app:request:http:latency:tier1:rate 6h'
- expr: >
    (sum(rate(http timer bucket{app="example-app",le="+Inf"}[3d])) -
    sum(rate(http timer bucket{app="example-app",le="5"}[3d]))) /
    sum(rate(http timer bucket{app="example-app",le="+Inf"}[3d]))
  record: 'slo:example app:request:http:latency:tier1:rate 3d'
```

Now we can build smarter alerts

```
- alert: CriticalBudgetBurn
 labels:
  severity: page
 expr: |
     slo:example app:request:http:latency:tier1:rate 1h > (13.44 * .01)
     and
     slo:example app:request:http:latency:tier1:rate 5m > (13.44 * .01)
   or
     slo:example app:request:http://atency:tier1:rate 6h > (5.6 * .01)
     and
     slo:example_app:request:http:latency:tier1:rate 30m > (5.6 * .01)
```



Real World Example



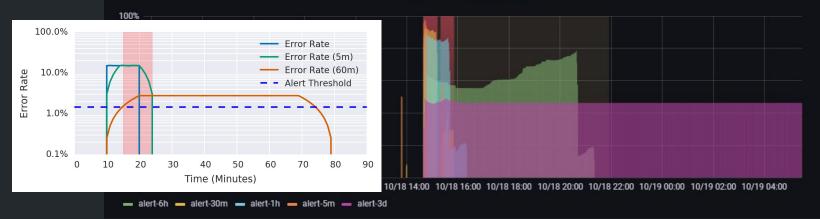


10/18 04:00 10/18 06:00 10/18 08:00 10/18 10:00 10/18 12:00 10/18 14:00 10/18 16:00 10/18 18:00 10/18 20:00 10/18 22:00 10/19 00:00 10/19 02:00 10/19 04:00

— 1h rate — 30 m rate — 5m rate — 6h rate







Alerting Breakdown





Burn Rates



Burn Rates w/Alert Overlay



- alert-6h - alert-30m - alert-1h - alert-5m - alert-3d

SLO Alerting Advice: Follow the SRE Book

- Use a 30d window
- Use the example rate windows (5m,30m,1h,6h,3d)
- Use the example alert rules

https://sre.google/workbook/alerting-on-slos/

Tone Shift!

Let's Talk K8s and Cloud Native

What about the Dashboards?

Solution: Grafana Operator

The <u>grafana-operator</u> has support for a dashboard CRD!

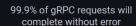
Unfortunately, it doesn't work work for grafana cloud

- We used the <u>operator-sdk</u> to build a custom operator at Weave which could
 - Take a sample dashboard JSON
 - Do some string substitutions
 - Apply to Grafana Cloud





Request SLOs for __app__ - Class: __class__ Links: WGraph









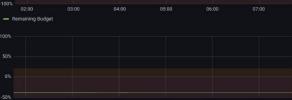


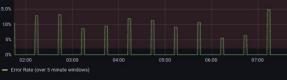
99% of gRPC requests will complete in under 5 second(s)





- Remaining Budget



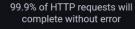


90% of gRPC requests will complete in under 1 second(s)

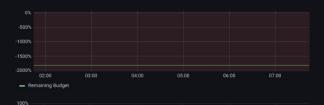










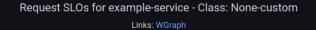


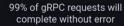


Example Dashboard YAML

```
apiVersion: custom.weave/v1beta1
kind: Dashboard
metadata:
 name: dashboard-sample
spec:
 grafana: local
 title: test-dash
  json: |
        "title": " app SLOs",
        "panels": [
        "timezone": "",
jsonReplacements:
    - find: app
      replace: example-app
```

Generated Dashboards









99% of gRPC requests will complete in under 2.5 second(s)





90% of gRPC requests will complete in under 5 second(s)







The Scale Issue

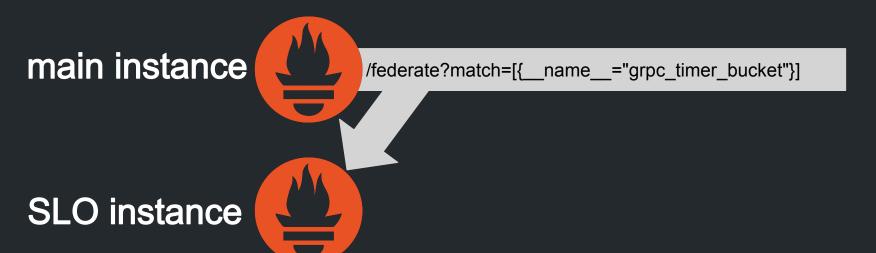
Prometheus Scaling Concerns

- The "main" Prometheus is huge and busy
- Our SLO is for 28 days but our main Prometheus is 14 days only
- SLO calculations can add load



Solution: Federation!

- Prometheus exposes a "federate" endpoint
 - Takes zero or more match expressions to filter returned results
- Essentially: Scrape Prometheus metrics from Prometheus



prometheus-operator to the rescue!

```
apiVersion: monitoring.coreos.com/v1
kind: Prometheus
metadata:
  name: prometheus-slo
  labels:
    prometheus: prometheus-slo
spec:
  replicas: 1
  retention: 28d
  serviceAccountName: prometheus-slo
  serviceMonitorSelector:
    matchLabels:
      scraper: prometheus-slo
```

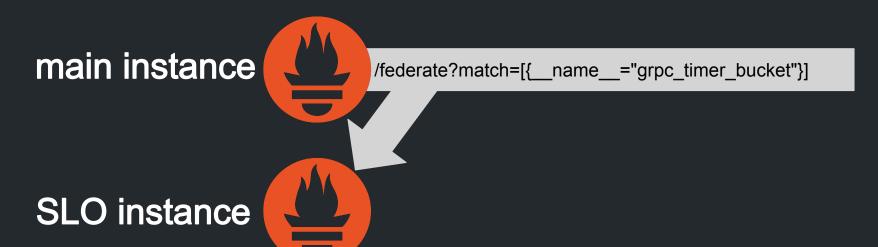
prometheus-operator to the rescue!

```
apiVersion: monitoring.coreos.com/v1
kind: PodMonitor
metadata:
  name: prometheus-slo-metrics
 labels:
    scraper: prometheus-slo
spec:
  jobLabel: prometheus-export-slo-rules
  namespaceSelector:
    matchNames:
      - prometheus
  selector:
    matchLabels:
     prometheus: main
  podMetricsEndpoints:
    - honorLabels: true
      interval: 30s
      params:
        'match[]':
          - '{ name =~"grpc timer bucket"}'
          - '{    name =~"http timer bucket"}'
      path: /federate
      targetPort: 9090
```

The Retention Issue

SLO Retention Concerns

- Management wants 2 years of slo budget history
- Increasing even the slo Prometheus to 2y retention keeps all metrics forever



Add Another Layer!

main instance

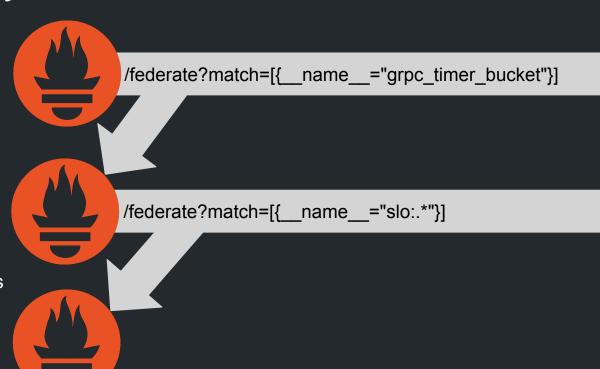
- 14d retention
- all metrics for cluster
- no calculations required

SLO instance

- 28d retention
- just slo metrics + calculations

export instance

- 2y
- just slo recording rules



prometheus-operator to the rescue!

```
apiVersion: monitoring.coreos.com/v1
kind: Prometheus
metadata:
  name: prometheus-export
  labels:
    prometheus: prometheus-export
spec:
  replicas: 1
  retention: 2y
  serviceAccountName: prometheus-export
  serviceMonitorSelector:
    matchLabels:
      scraper: prometheus-export
```

prometheus-operator to the rescue!

```
apiVersion: monitoring.coreos.com/v1
kind: PodMonitor
metadata:
  labels:
    scraper: prometheus-export
  name: prometheus-export-slo-rules
spec:
  jobLabel: prometheus-export-slo-rules
  selector:
    matchLabels:
      prometheus: slo
  namespaceSelector:
    matchNames:
      - prometheus-slo
  podMetricsEndpoints:
    - honorLabels: true
      interval: 30s
      params:
        'match[]':
          - '{    name =~"slo:.*"}'
      path: /federate
      targetPort: 9090
```

Prometheus Federation Series Count Funnel

main instance

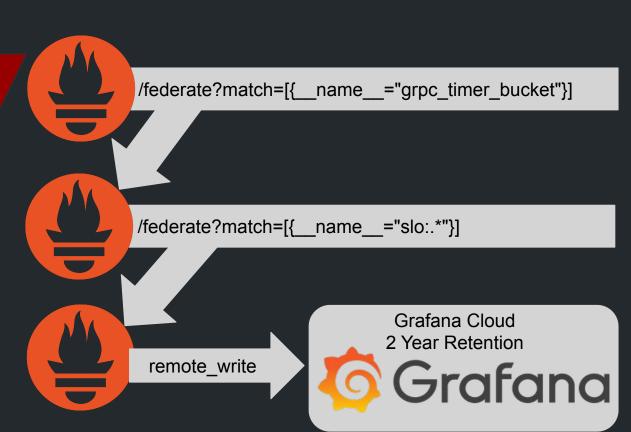
ALL metrics for the system

SLO instance

http_timer_bucket grpc_timer_bucket slo:*

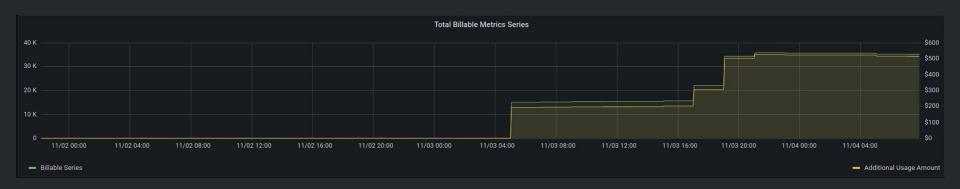
slo:*

export instance

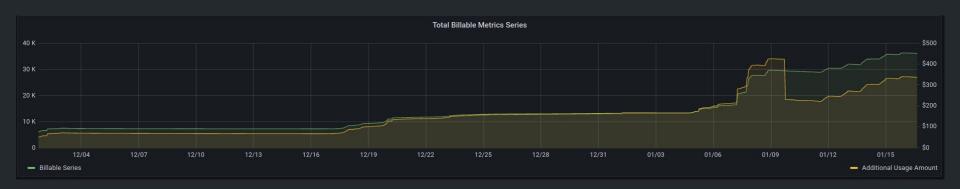


Grafana Cloud Billing Impact

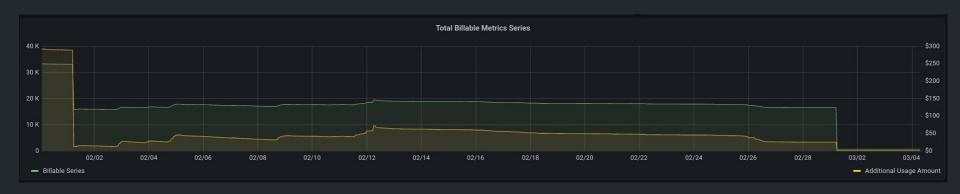
Ship ALL metrics



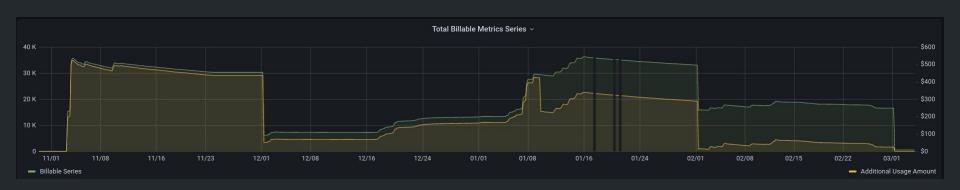
Ship Recording Rules



Ship only slo:* rules



Full Billing Timeline



Final Advice

- Standardize your metrics
- Pick 1 or 2 objectives to start with
- Use a 30d window if you can
- Automate & Generate!

Thank You! SLOs In Practice

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@carson_ops