

**inloco**

An aerial, top-down view of a city street intersection. The scene is dominated by a large, circular plaza in the lower right quadrant, which features a vibrant, multi-colored geometric pattern in shades of blue, green, yellow, and purple. The surrounding urban environment includes various buildings, some with distinctive domes and ornate facades, and a network of roads with cars and pedestrians. The overall lighting suggests a bright, sunny day.

# Desenvolvimento de aplicações web com R Shiny

Como escalar produtos de dados de  
forma rápida e confiável

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Estatística

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Cientista de Dados.





**> 60M**  
de smartphones no Brasil



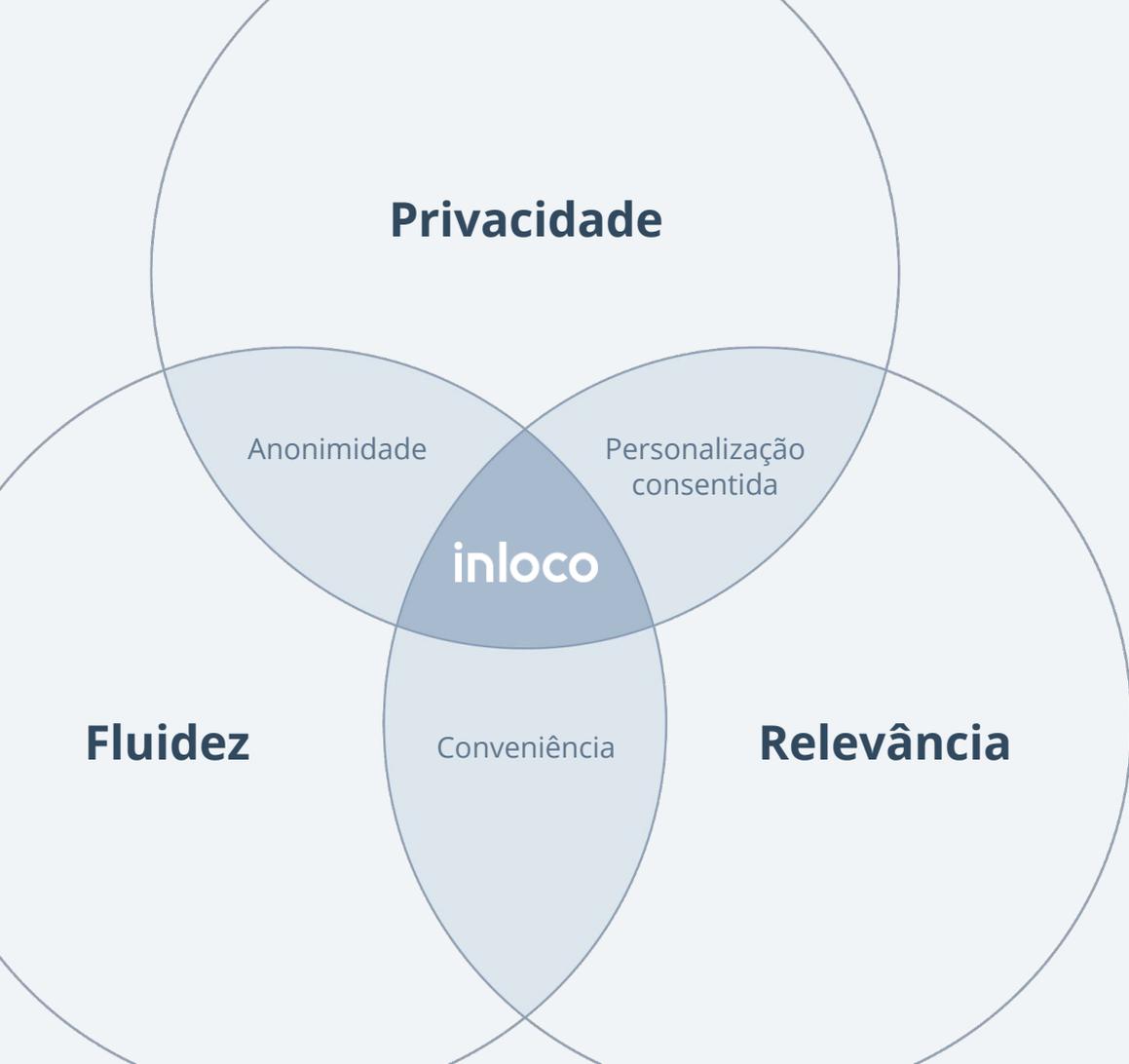
**> 16TB**  
de dados processados  
diariamente



**> 28M**  
de lugares mapeados

An aerial photograph of a city street intersection. In the foreground, there is a large, circular, colorful mural on the pavement, featuring geometric patterns in shades of blue, green, and purple. The street is paved with asphalt and has several cars parked and driving. In the background, there are buildings, including a prominent one with a red roof and several golden domes. The overall scene is brightly lit, suggesting a sunny day.

# inloco



# Nosso propósito

Entregar conveniência para as pessoas garantindo sua privacidade.

## Sessão

**1.**

O que é Shiny?

**Conhecendo o framework de R que nos ajuda a criar aplicações**

**2.**

Lidando com banco de dados

**Entendo a comunicação com bancos e boas práticas**

**3.**

Testando sua aplicação

**Buscando gargalos e melhorando a performance**

**4.**

Deploy

**Como disponibilizar sua aplicação de forma segura**

# Flow of Passers

Data from 01 to 11 January 2019

## Filter

Player

All

Placement points

All

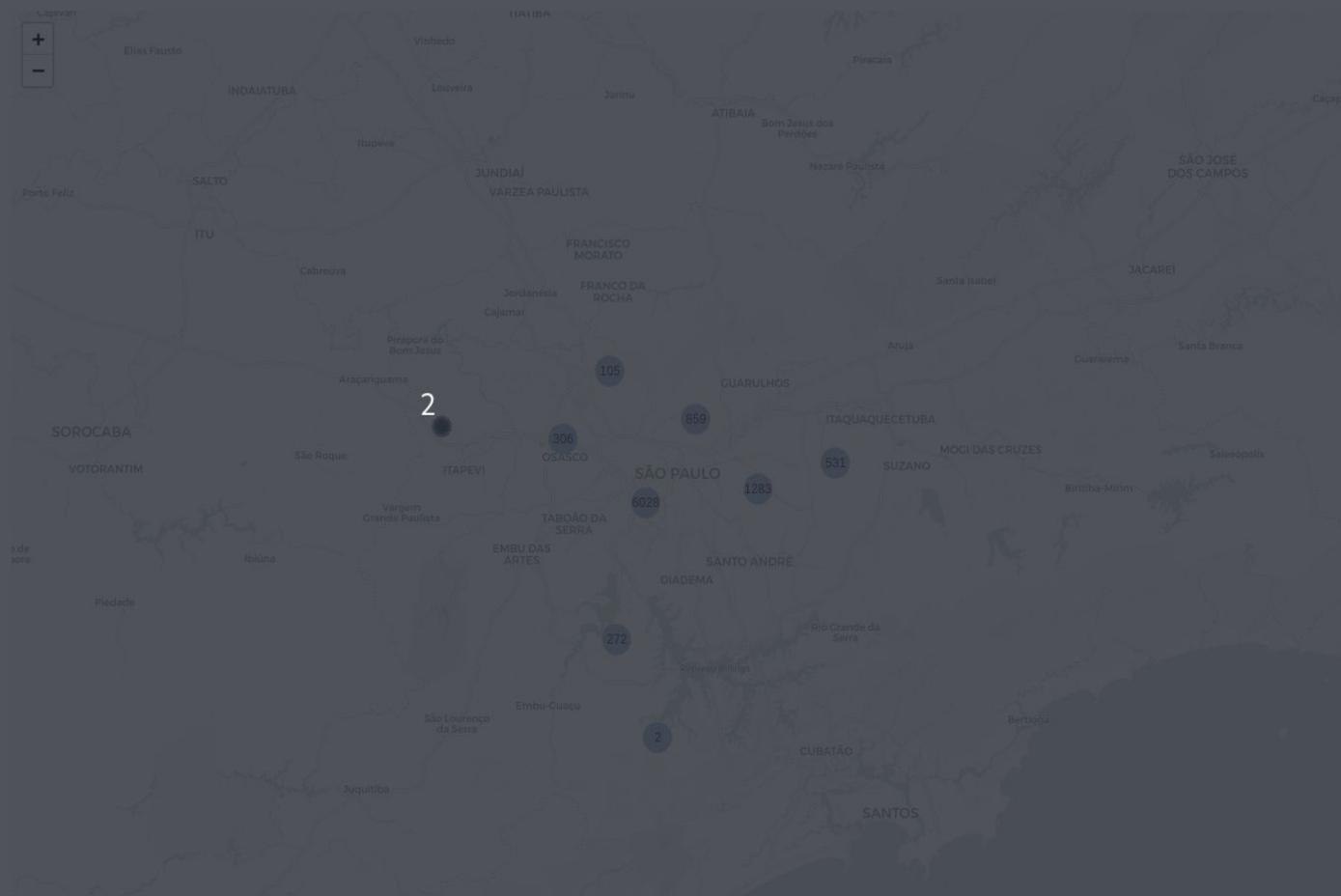
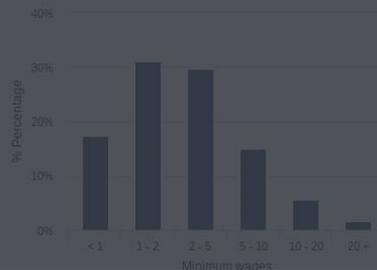
Audience

General flow per point

## Gender



## Income

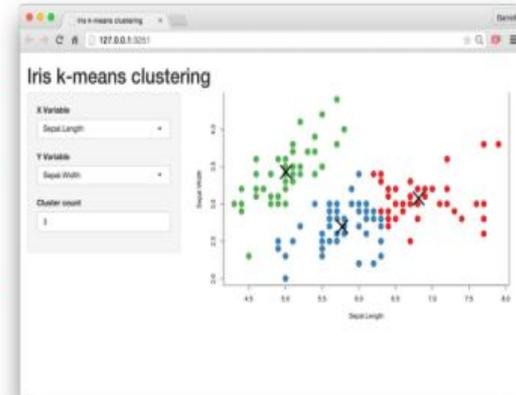


**O que é Shiny?**



**Um pacote em R  
para  
desenvolvimento  
de aplicações  
web.**

**Todo aplicativo Shiny possui uma página da web que o usuário visita e, por trás dessa página, há um computador que serve essa página executando R.**







Instruções do Server



Interface do usuário

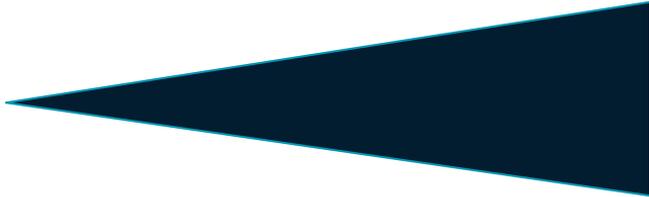
# Anatomia de uma aplicação Shiny

```
library(shiny)
```

```
ui <- fluidPage(  
)
```

```
server <- function(input, output, session) {  
}
```

```
shinyApp(ui, server)
```



**Interface do usuário**  
Controla o layout e  
aparência do app



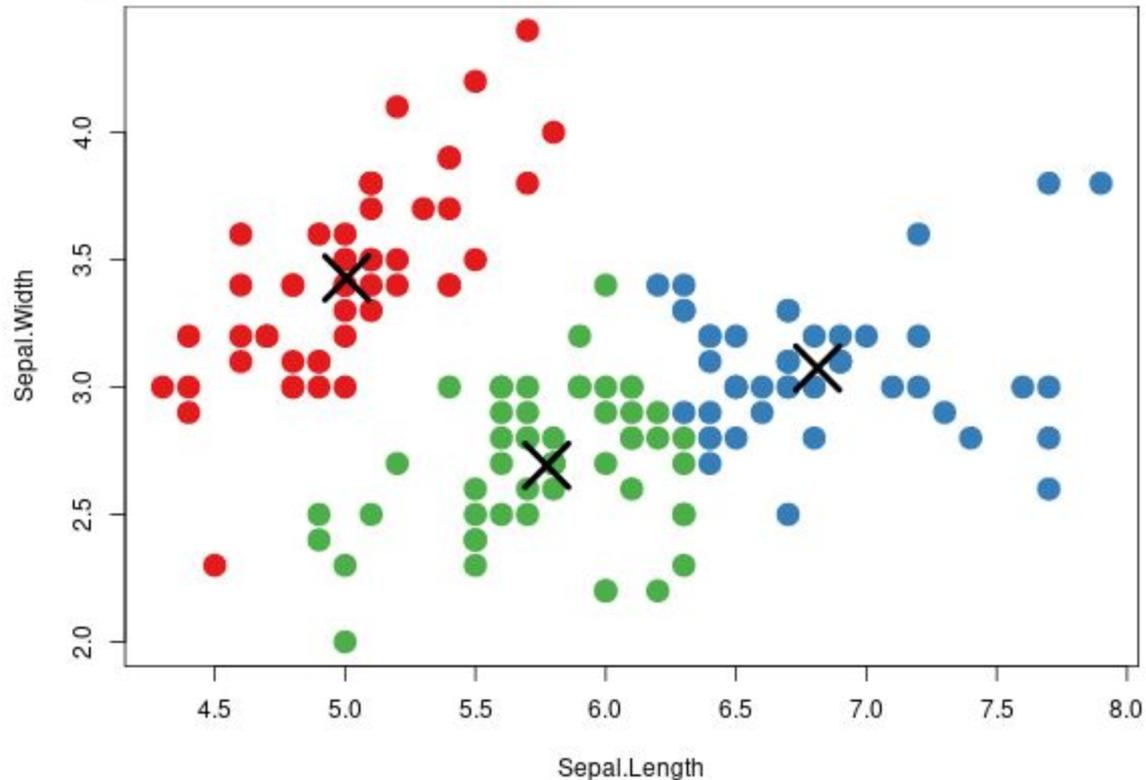
**Função server**  
Contém as instruções  
necessárias para  
construir o app

# Iris k-means clustering

**X Variable**  
Sepal.Length

**Y Variable**  
Sepal.Width

**Cluster count**  
3

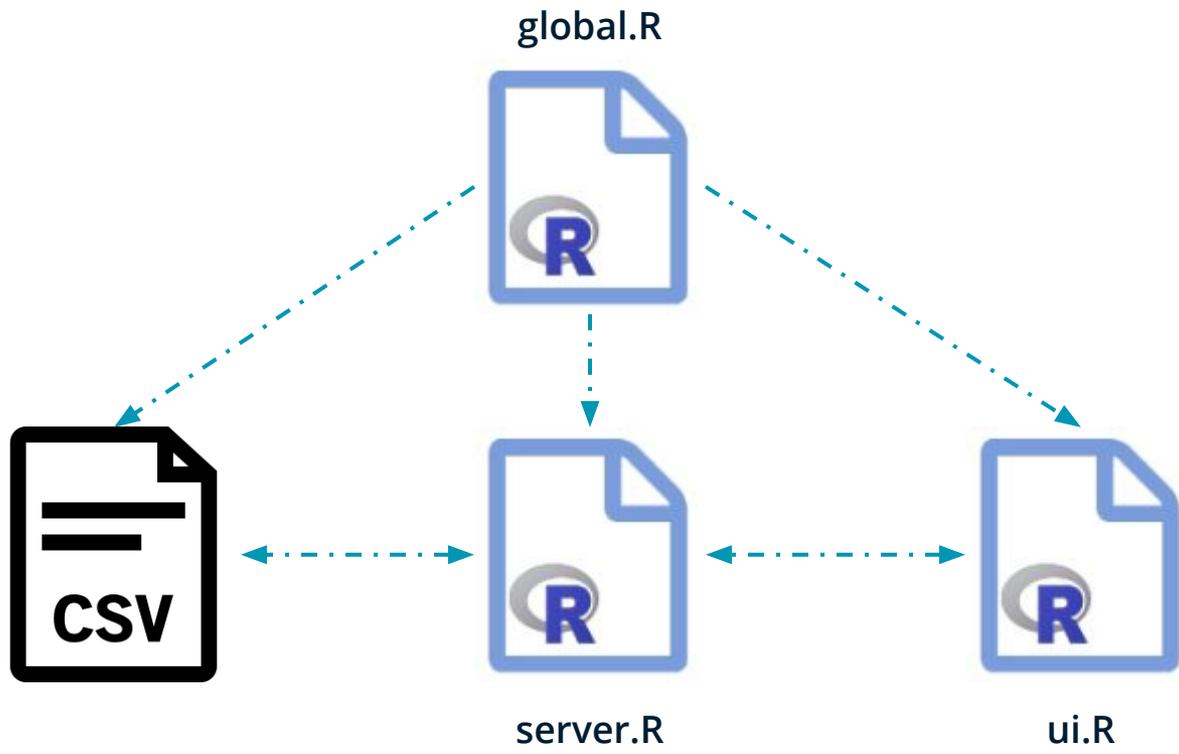


## server.R

```
function(input, output, session) {  
  
  # Combine the selected variables into a new data frame  
  selectedData <- reactive({  
    iris[, c(input$xcol, input$ycol)]  
  })  
  
  clusters <- reactive({  
    kmeans(selectedData(), input$clusters)  
  })  
  
  output$plot1 <- renderPlot({  
    palette(c("#E41A1C", "#377EB8", "#4DAF4A", "#984EA3",  
             "#FF7F00", "#FFFF33", "#A65628", "#F781BF", "#999999"))  
  
    par(mar = c(5.1, 4.1, 0, 1))  
    plot(selectedData(),  
          col = clusters()$cluster,  
          pch = 20, cex = 3)  
    points(clusters()$centers, pch = 4, cex = 4, lwd = 4)  
  })  
  
}
```

## ui.R

```
pageWithSidebar(  
  headerPanel('Iris k-means clustering'),  
  sidebarPanel(  
    selectInput('xcol', 'X Variable', names(iris)),  
    selectInput('ycol', 'Y Variable', names(iris),  
               selected=names(iris)[[2]]),  
    numericInput('clusters', 'Cluster count', 3,  
                 min = 1, max = 9)  
  ),  
  mainPanel(  
    plotOutput('plot1')  
  )  
)
```



**Lidando com banco de dados**

# Mas antes...

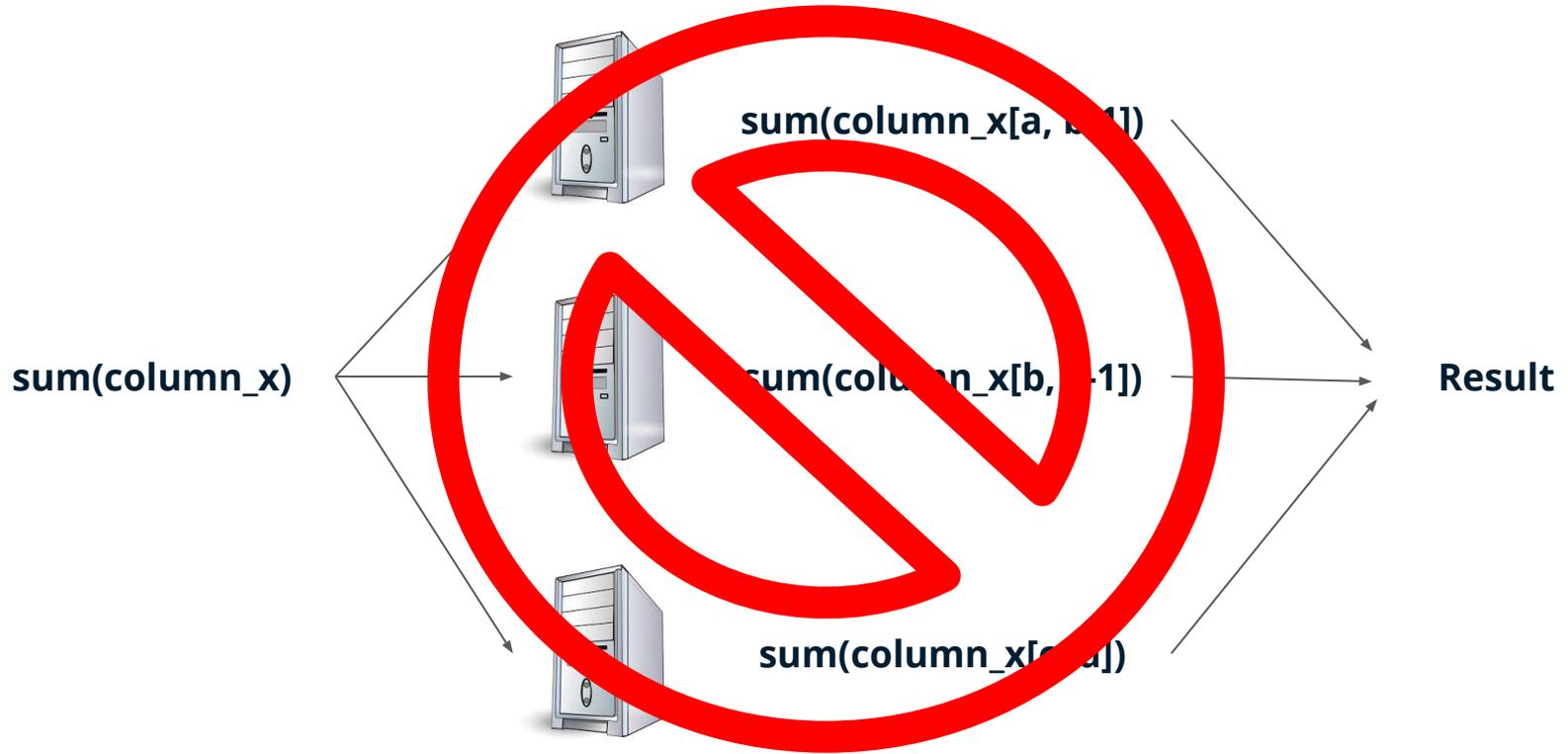
Esses formatos compactam seu arquivo de maneira que você tenha um alto desempenho de leitura dentro do aplicativo:

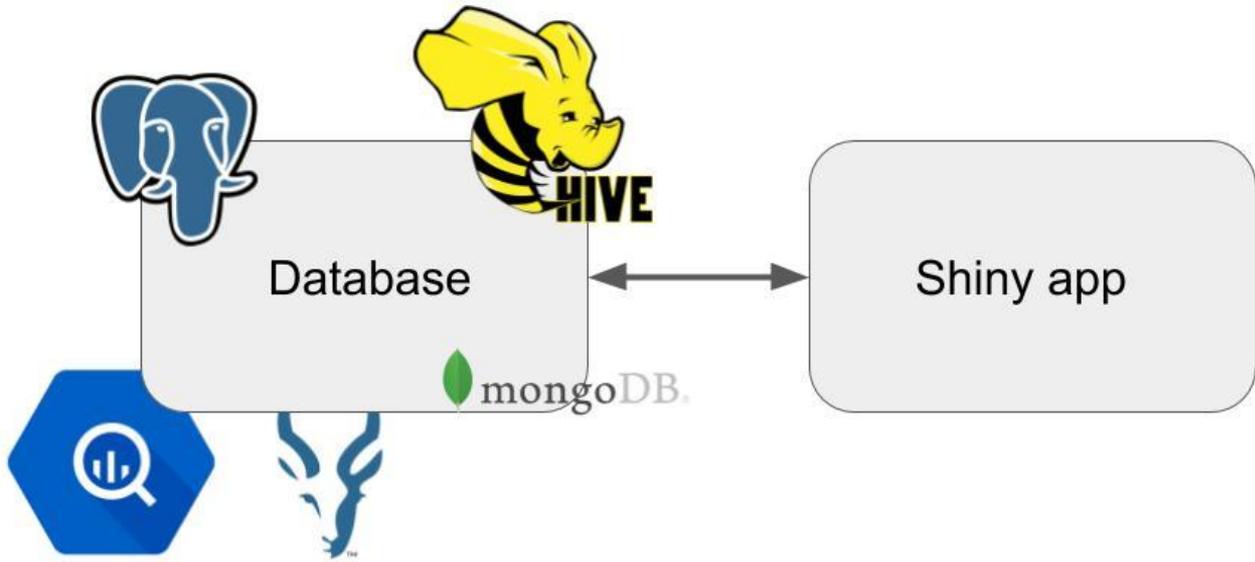
- .feather
- .RDS

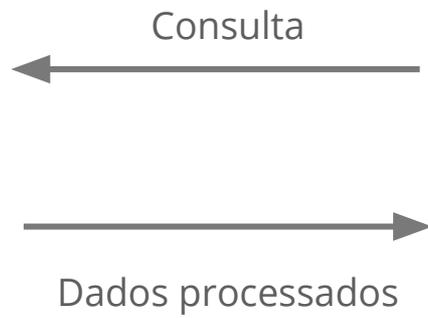
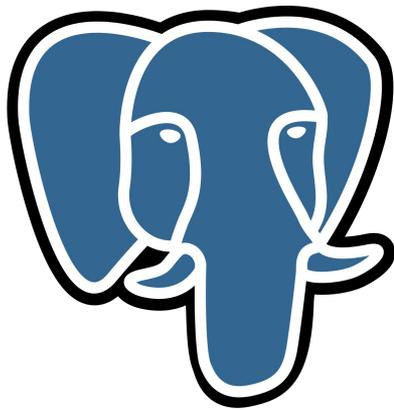


**Conectando-se a um grande volume de dados.**

# R é single-threaded







Podemos continuar usando o maravilhoso pacote *dplyr* para realizar as consultas ao banco de dados, a partir da versão *dbplyr*.



```
library(dplyr)

con <- DBI::dbConnect(RPostgreSQL::PostgreSQL(),
  host = "database.inloco.com",
  user = "insights",
  password = rstudioapi::askForPassword("Database password")
)
```

```
tbl(con, "flights") %>% select(year:day, dep_delay, arr_delay)
#> # Source:   lazy query [?? x 5]
#> # Database: sqlite 3.22.0 []
#>   year month   day dep_delay arr_delay
#>   <int> <int> <int>     <dbl>     <dbl>
#> 1  2013     1     1         2         11
#> 2  2013     1     1         4         20
#> 3  2013     1     1         2         33
#> 4  2013     1     1        -1        -18
#> 5  2013     1     1        -6        -25
#> 6  2013     1     1        -4         12
#> # ... with more rows
```

```
tbl(con, "flights") %>%
  group_by(dest) %>%
  summarise(delay = mean(dep_time))
#> Warning: Missing values are always removed in SQL.
#> Use `mean(x, na.rm = TRUE)` to silence this warning
#> This warning is displayed only once per session.
#> # Source:   lazy query [?? x 2]
#> # Database: sqlite 3.22.0 []
#>   dest  delay
#>   <chr> <dbl>
#> 1 ABQ   2006.
#> 2 ACK   1033.
#> 3 ALB   1627.
#> 4 ANC   1635.
#> 5 ATL   1293.
#> 6 AUS   1521.
#> # ... with more rows
```

## Pontos importantes

- Ao trabalhar com bancos de dados, o dplyr tenta ser o mais *lazy* possível;
- Podemos usar o comando *collect()* para retornar a tabela resultante para o ambiente local;
- O comando *pull()* também é útil quando a consulta retorna um vetor, e não uma tibble.

```
tbl(con, "flights") %>%
  group_by(tailnum) %>%
  summarise(
    delay = mean(arr_delay),
    n = n()
  ) %>%
  arrange(desc(delay)) %>%
  filter(n > 100) %>%
  show_query()
#> <SQL>
#> SELECT *
#> FROM (SELECT *
#> FROM (SELECT `tailnum`, AVG(`arr_delay`) AS `delay`, COUNT() AS `n`
#> FROM `flights`
#> GROUP BY `tailnum`)
#> ORDER BY `delay` DESC)
#> WHERE (`n` > 100.0)
```



# Cuidando das credenciais

- Criptografar credenciais com o pacote *keyring*;
- Use o arquivo de configuração;
- Variáveis de ambiente usando o arquivo `.Renviron`;
- Usando as opções de comando do R base;
- Solicite credenciais usando o RStudio IDE.

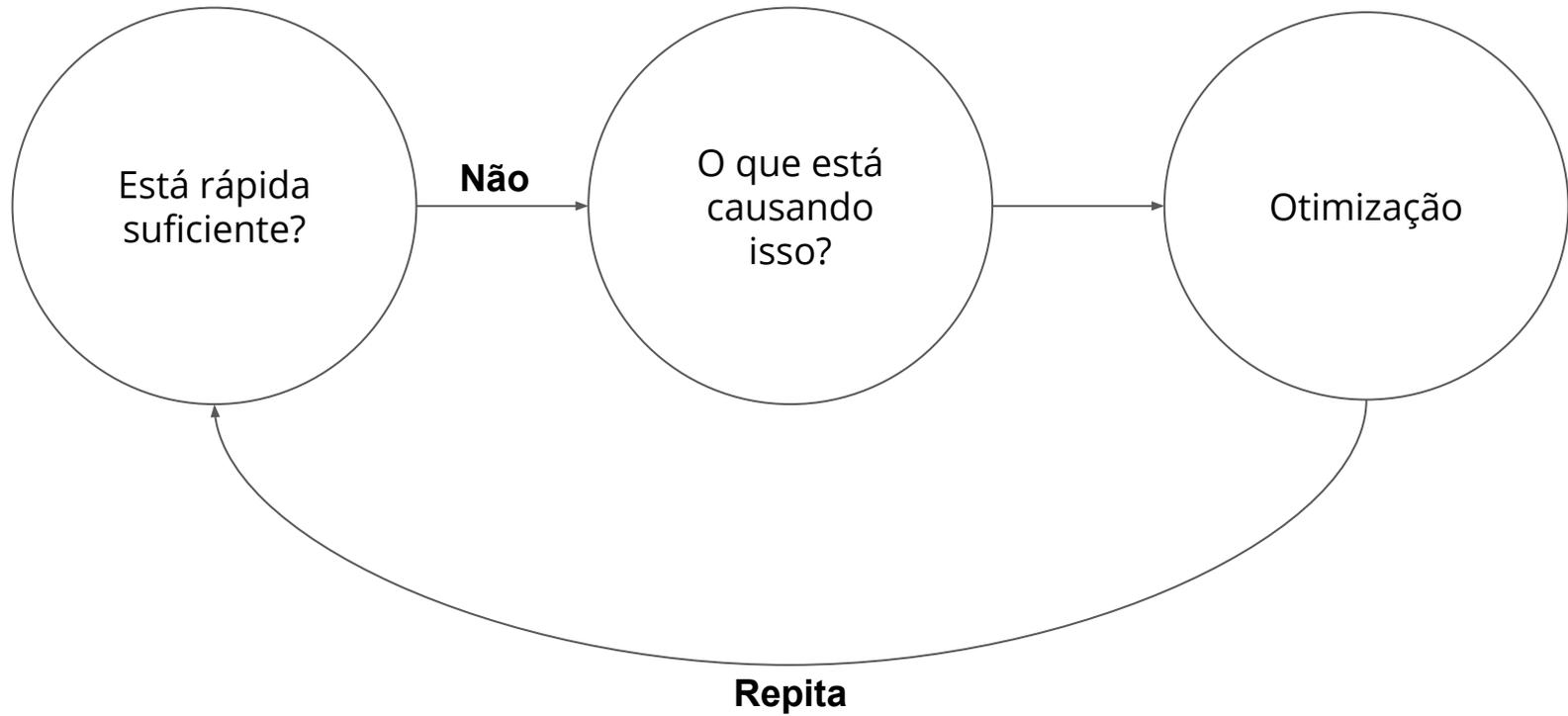
# Testando sua aplicação



shinyloadtest



profvis



# shinyloadtest

O processo para testar a carga de um aplicativo Shiny consiste em três etapas:

1. Grave uma sessão típica do usuário para o aplicativo;
2. Repita a sessão em paralelo, simulando muitos; usuários simultâneos acessando o aplicativo;
3. Analise os resultados do teste de carga e determine se o aplicativo teve bom desempenho.

1. `library(shinyloadtest)`

```
shinyloadtest::record_session('https://shinyapp.example.com/')
```

```
shinyloadtest::record_session('http://127.0.0.1:3509')
```

2. `[[1]] → shinycannon recording.log http://127.0.0.1:3509/ --workers 20 --loaded-duration-minutes 5`

```
2019-10-05 14:45:06.686 INFO [thread00] - Detected target application type: R/Shiny
```

```
2019-10-05 14:45:06.688 INFO [progress] - Running: 0, Failed: 0, Done: 0
```

```
2019-10-05 14:45:06.689 INFO [thread01] - Warming up
```

```
2019-10-05 14:45:06.699 INFO [thread00] - Waiting for warmup to complete
```

```
2019-10-05 14:45:07.774 INFO [thread02] - Warming up
```

```
2019-10-05 14:45:08.859 INFO [thread03] - Warming up
```

```
2019-10-05 14:45:09.945 INFO [thread04] - Warming up
```

```
2019-10-05 14:45:11.030 INFO [thread05] - Warming up
```

```
2019-10-05 14:45:11.689 INFO [progress] - Running: 5, Failed: 0, Done: 0
```

```
2019-10-05 14:45:12.115 INFO [thread06] - Warming up
```

```
2019-10-05 14:45:12.200 INFO [thread07] - Warming up
```

3. `df <- shinyloadtest::load_runs("report" = "./test-logs-2019-10-05T17_45_05.622Z")`  
`shinyloadtest::shinyloadtest_report(df, "report.html")`

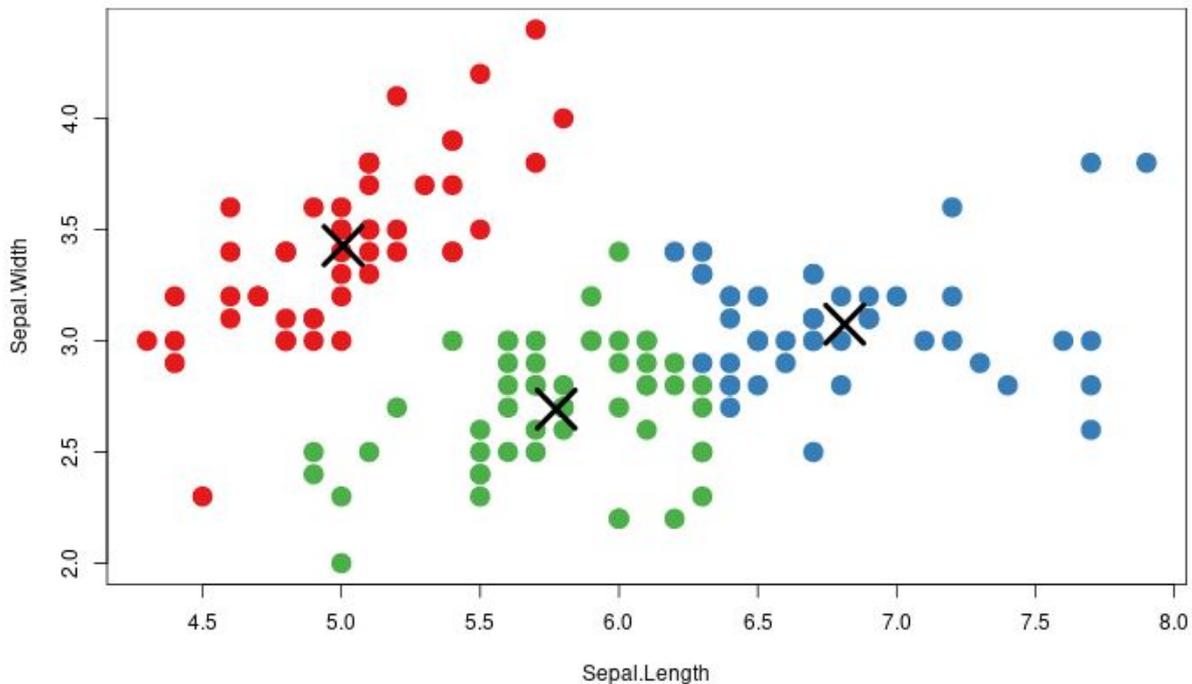
# Voltando...

## Iris k-means clustering

**X Variable**  
Sepal.Length

**Y Variable**  
Sepal.Width

**Cluster count**  
3



- Dados em um .csv;
- Lendo os dados sempre que for realizar um filtro.

Cenário 1

- Dados em um .feather;
- Múltiplos arquivos para cada combinação

Cenário 2

# shinyloadtest

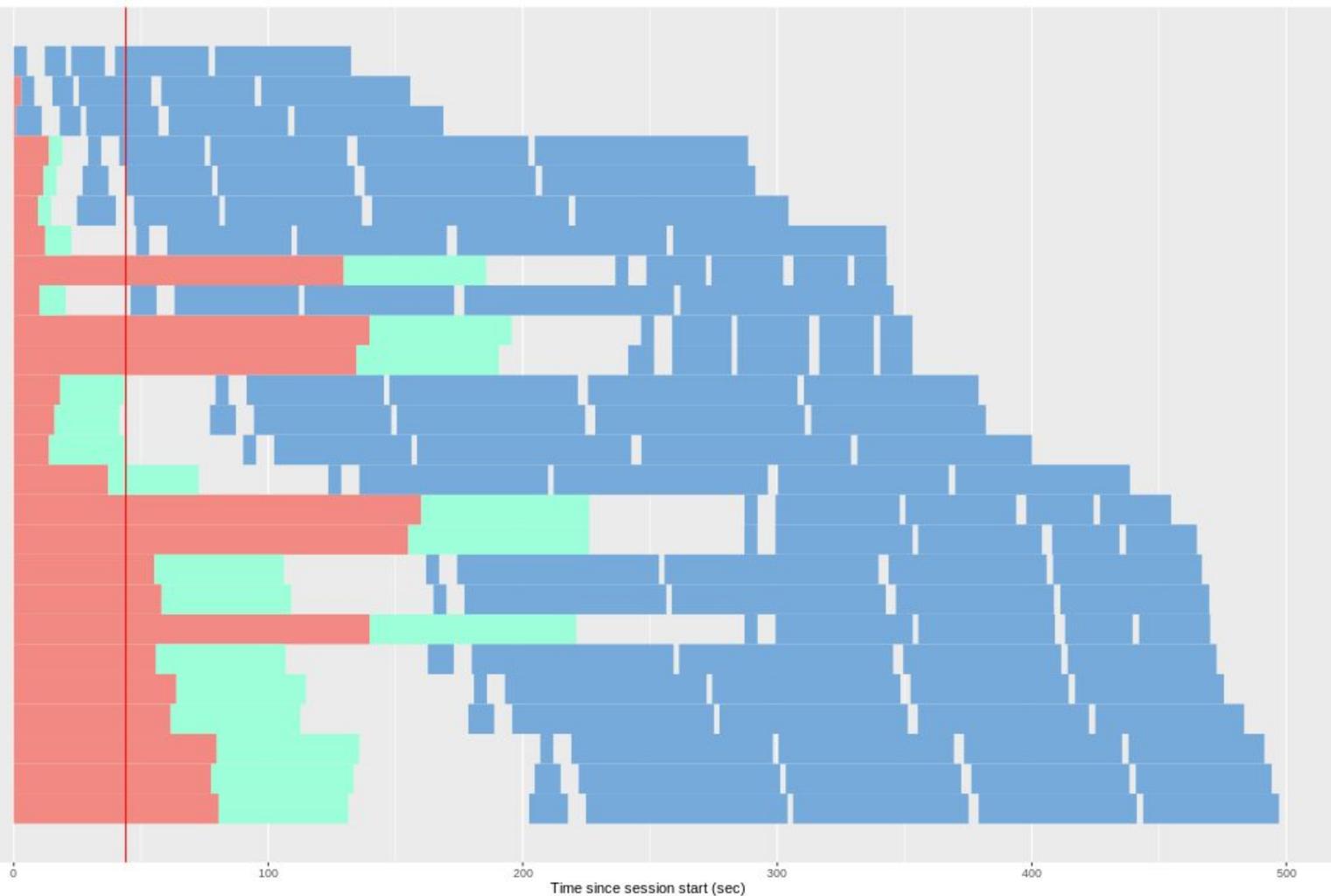
20 workers

- Sessions
- Session Duration
- Event Waterfall
- Latency
- Event Duration
- Event Concurrency

26 maintenance sessions ordered from fastest to slowest completion time. The red line marks how long the original recording session took to complete (~44s). Sessions should end around the same time as each other for consistent behavior.



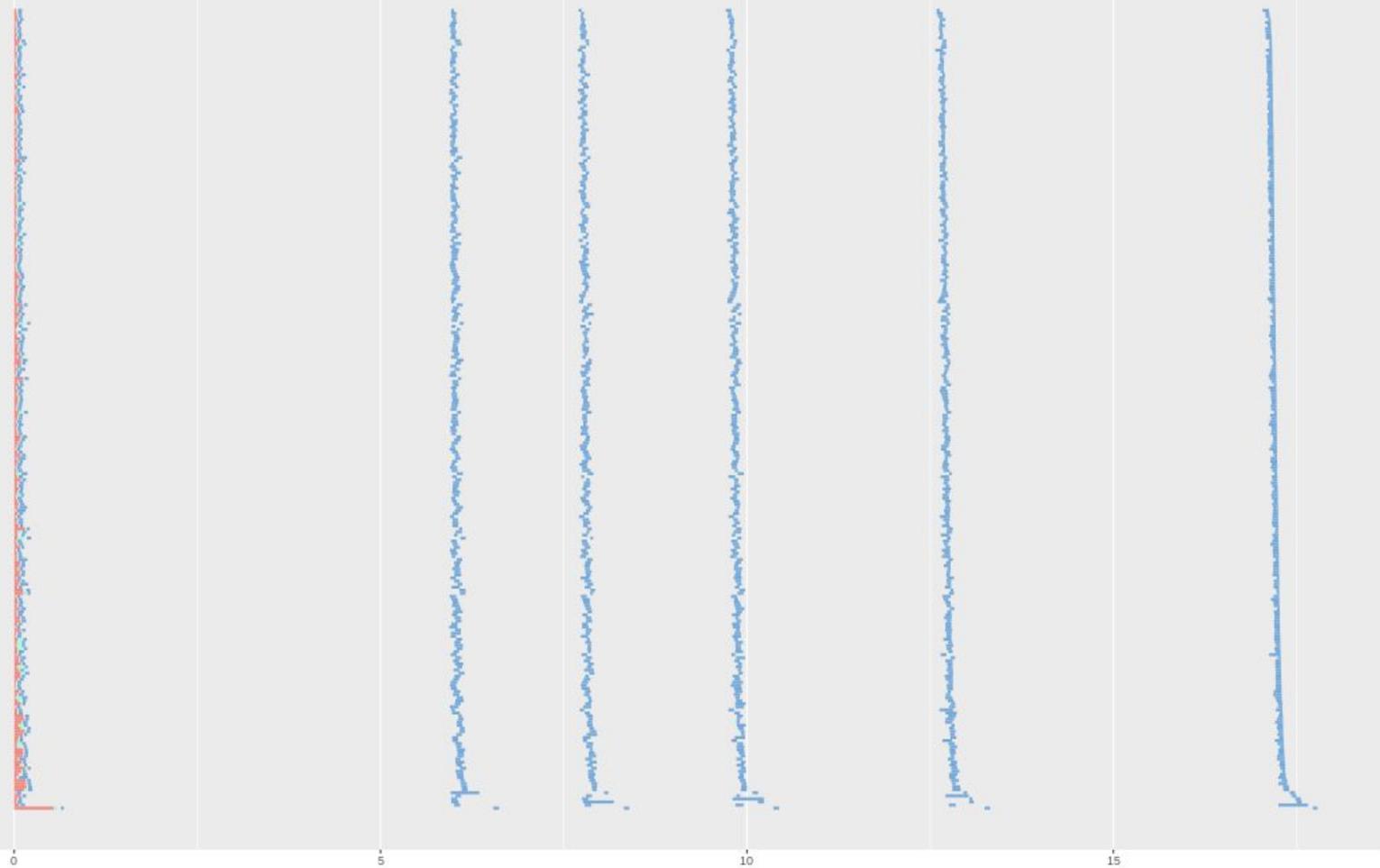
Sessions ordered by total duration



Homepage JS/CSS Start session Calculate

Cenário 1

Sessions ordered by total duration



Homepage JS/CSS Start session Calculate

Cenário 2

# profvis

O profvis é uma ferramenta para ajudar você a entender como o R gasta seu tempo.

```
library(profvis)
```

```
profvis({runApp('Downloads/tdc_app')})
```

| Flame Graph                        |   | Data |               |             | Options ▾ |
|------------------------------------|---|------|---------------|-------------|-----------|
| <b>&lt;expr&gt;</b>                |   |      | <b>Memory</b> | <b>Time</b> |           |
| 1                                  | profvis({runApp('Downloads/tdc_app')})                  |      | 5.9           | 2690        |           |
| 2                                  |   |      |               |             |           |
| <b>/Downloads/tdc_app/server.R</b> |   |      | <b>Memory</b> | <b>Time</b> |           |
| 1                                  | function(input, output, session) {                      |      |               |             |           |
| 2                                  |   |      |               |             |           |
| 3                                  | # Combine the selected variables into a new data frame  |      |               |             |           |
| 4                                  | selectedData <- reactive({                              |      |               |             |           |
| 5                                  | Sys.sleep(5)  |      | 0.7           | 1340        |           |
| 6                                  | iris[, c(input\$xc, input\$yc)]                         |      |               | 20          |           |
| 7                                  | })  |      |               |             |           |
| 8                                  |   |      |               |             |           |
| 9                                  | clusters <- reactive({                                  |      |               |             |           |
| 10                                 | kmeans(selectedData(), input\$clusters)                 |      | 0.1           | 20          |           |
| 11                                 | })  |      |               |             |           |
| 12                                 |   |      |               |             |           |
| 13                                 | output\$plot1 <- renderPlot({                           |      |               |             |           |
| 14                                 | palette(c("#E41A1C", "#377EB8", "#4DAF4A", "#984EA3",   |      |               |             |           |
| 15                                 | "#FF7F00", "#FFFF33", "#A65628", "#F781BF", "#999999")) |      |               |             |           |
| 16                                 |   |      |               |             |           |
| 17                                 | par(mar = c(5.1, 4.1, 0, 1))                            |      | 0.1           | 10          |           |
| 18                                 | plot(selectedData(),                                    |      | 1.1           | 1510        |           |
| 19                                 | col = clusters()\$cluster,                              |      |               |             |           |
| 20                                 | pch = 20, cex = 3)                                      |      |               |             |           |
| 21                                 | points(clusters()\$centers, pch = 4, cex = 4, lwd = 4)  |      |               | 20          |           |
| 22                                 | })  |      |               |             |           |
| 23                                 |   |      |               |             |           |
| 24                                 | }   |      |               |             |           |

&lt;expr&gt;

1 profvis({runApp('Downloads/tdc\_app')})

2

/Downloads/tdc\_app/server.R

1 function(input, output, session) {

2

3 # Combine the selected variables into a new data frame

4 selectedData &lt;- reactive({

5 iris[, c(input\$xcol, input\$ycol)]

6 })

7

8 clusters &lt;- reactive({

9 kmeans(selectedData(), input\$clusters)

10 })

11

12 output\$plot1 &lt;- renderPlot({

13 palette(c("#E41A1C", "#377EB8", "#4DAF4A", "#984EA3",

14 "#FF7F00", "#FFFF33", "#A65628", "#F781BF", "#999999"))

15

16 par(mar = c(5.1, 4.1, 0, 1))

17 plot(selectedData(),

18 col = clusters()\$cluster,

19 pch = 20, cex = 3)

20 points(clusters()\$centers, pch = 4, cex = 4, lwd = 4)

21 })

22

23 }

Memory

5.6

Time

1090

Memory

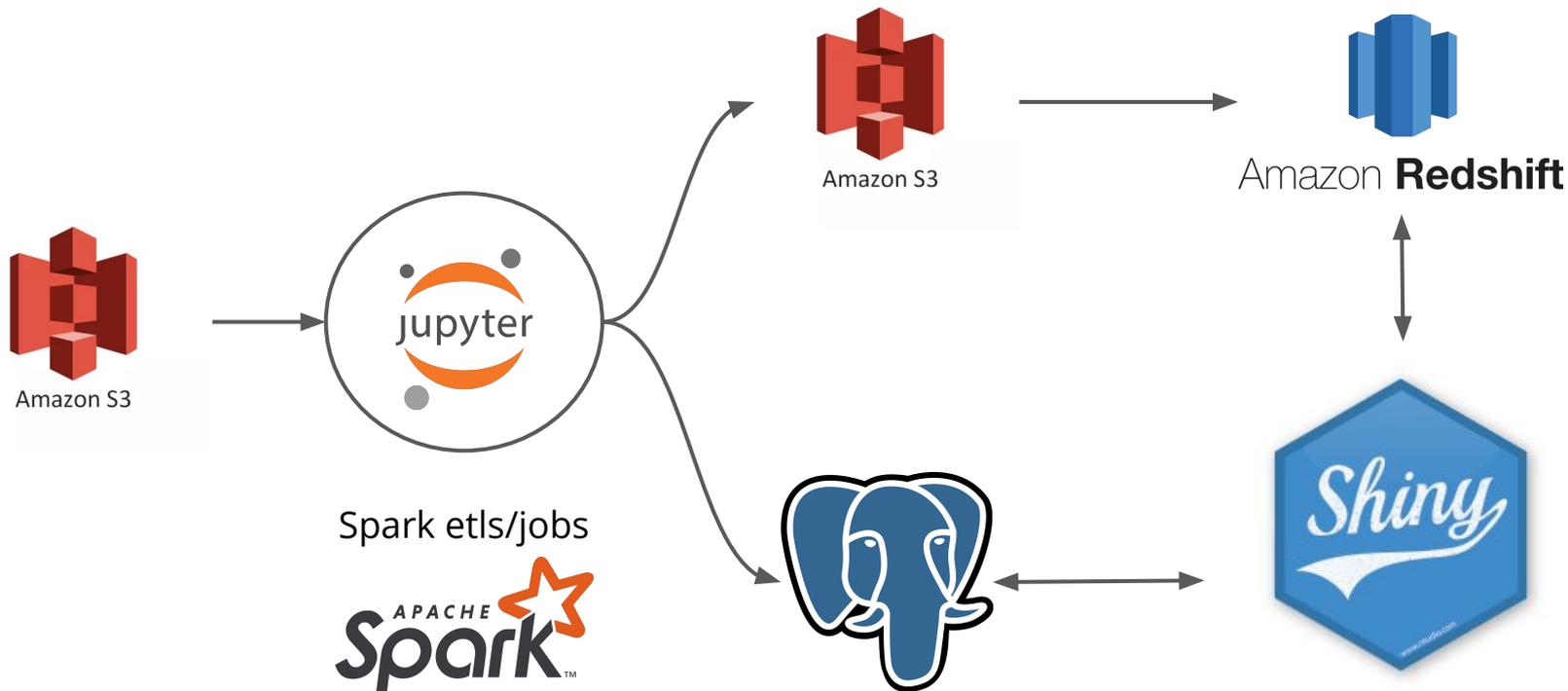
0.3

10

1.2

80

# Faça o trabalho fora da aplicação



**Deploy**



**Sistema  
operacional**

**Dependências**

**Versão do R**

**Pacotes**

# Compartilhando ou disponibilizando sua aplicação

Algumas opções:

- [Shinyapps.io](https://shinyapps.io/);
- Shiny server (open source);
- Shiny server pro.



docker

# O que é Docker?

O Docker é uma ferramenta projetada para facilitar a criação, implantação e execução de aplicativos usando contêineres. De certa forma, o Docker é um pouco como uma máquina virtual.

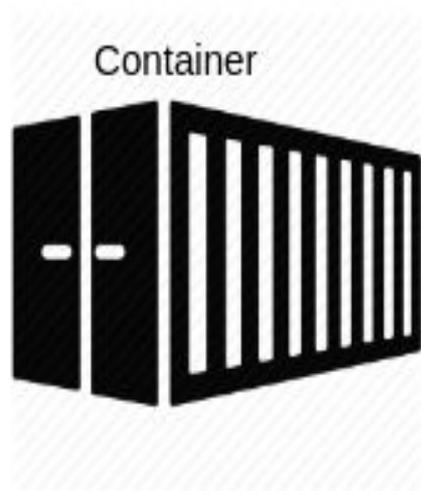
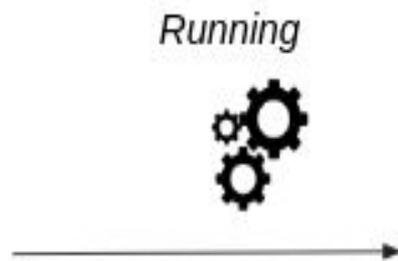
## Imagem

Eles são "modelos prontos para uso com instruções para criar um contêiner Docker".

Define o código do contêiner, bibliotecas, variáveis de ambiente, arquivos de configuração e muito mais.

## Contêiner

Um contêiner do Docker é um ambiente isolado em execução no kernel de uma máquina host que permite executar código específico do aplicativo.



# Image Compression - PCA

Number of PC to be used in the compression:

2 64



1 8 15 22 29 36 43 50 57 64



```
FROM quantumobject/docker-shiny
```

Imagem base com o Shiny server instalado

```
RUN apt-get update \  
  && apt-get install -y libcurl4-openssl-dev libssl-dev libxml2-dev libpq-dev \  
  && apt-get clean \  
  && rm -rf /tmp/* /var/tmp/* \  
  && rm -rf /var/lib/apt/lists/*
```

Instalando algumas dependências

```
RUN R -e "install.packages('tidyverse')"  
RUN R -e "install.packages('shiny')"  
RUN R -e "install.packages('EMD')"  
RUN R -e "install.packages('blockmatrix')"
```

Instalando os pacotes que vamos utilizar em R

```
RUN rm -rf /srv/shiny-server/*
```

```
COPY ./app_image_comp /srv/shiny-server
```

Copiando a pasta que contém meu app

```
EXPOSE 3838
```

```
# Use baseimage-docker's init system.  
CMD ["/sbin/my_init"]
```

Iniciando a aplicação



Search or jump to...



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[gabrielteotonio](#) / [docker-shiny](#)

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1 branch

0 packages

0 releases

1 contributor

Branch: **master** ▾

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**gabrielteotonio** delete results folder

Latest commit 30fa1a1 on May 30

|                                  |  |              |
|----------------------------------|--|--------------|
| <a href="#">analysis_example</a> | delete results folder                  | 4 months ago |
| <a href="#">app_example</a>      | code reproducibility part partial done | 5 months ago |
| <a href="#">presentation</a>     | new presentation                       | 4 months ago |
| <a href="#">README.md</a>        | app tutorial - dockerfile and build    | 5 months ago |

[README.md](#)





r-base ☆

Docker Official images

R is a system for statistical computation and graphics.

1M+

Container Linux ARM 64 x86-64 Application Services Official Image



rocker/tidyverse ☆

By rocker • Updated 12 hours ago

Version stable build of R, rstudio, and R packages

Container

Overview Tags Dockerfile Builds

PASSED linux GPU v3 repo metrics 201 10 510

Visit rocker-project.org for more about available Rocker im

Version-stable Rocker images



image description



rocker/rstudio ☆

By rocker • Updated 15 hours ago

RStudio Server image

Container

Overview Tags Dockerfile Builds

PASSED linux RPU repo metrics 201 10 510

Visit rocker-project.org for more about available Rocker images, configuration, and use.

Version-stable Rocker images



rocker/tensorflow ☆

By rocker • Updated 2 hours ago

Tensorflow & Keras libraries for machine learning (CPU version)

Container

Overview Tags Dockerfile Builds

Rocker stack for Machine Learning in R

This repository contains images for machine learning and GPU-based computation in R.

The dependency stack looks like so:

```
-| rocker/tidyverse
  | rocker/tensorflow
  -| rocker/ml
-| rocker/cuda
  -| rocker/tensorflow-gpu
  -| rocker/ml-gpu
  -| rocker/cuda-dev
```

Nvidia CUDA libraries to the rocker-versioned stack (building on rocker/tidyverse).

Docker Pull Command

```
docker pull rocker/t
```

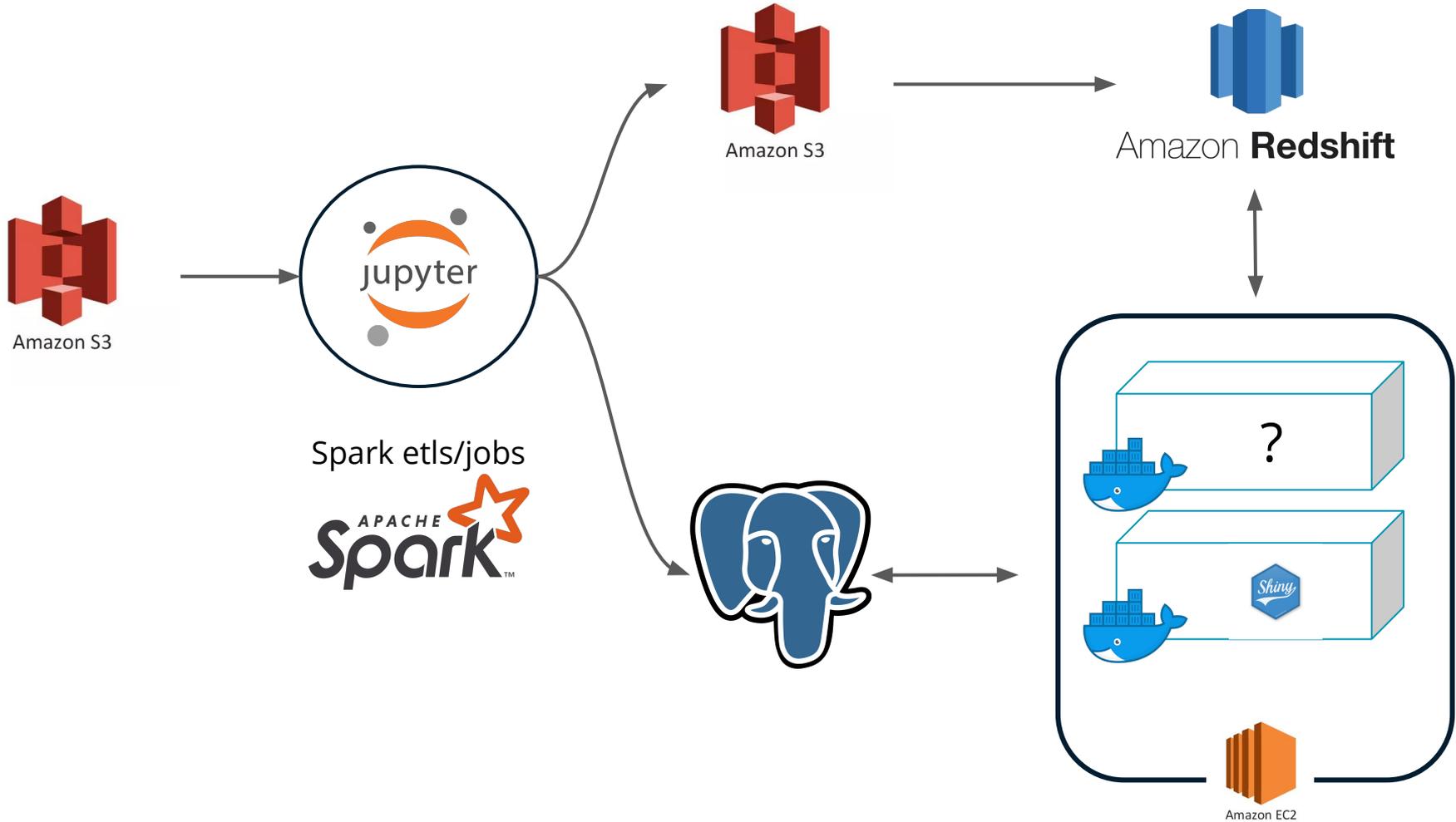
Owner

rocker

Source Repository

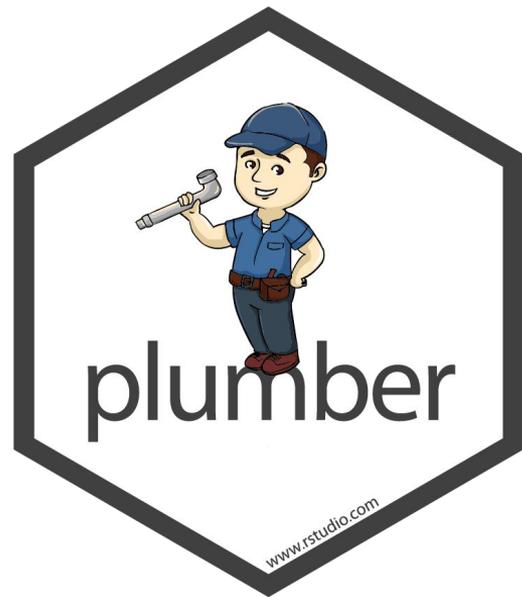
GitHub rocker-org/ml

Supported tags ar



# Criando APIs

Um pacote que converte seu código em uma REST API simplesmente decorando seu código existente em R com comentários especiais.



```
data <- iris
kmeans_object <- kmeans(data, 3)

pred <- function(comprimento, largura) {
  predict(kmeans_object, newdata = data.frame(sepal_length = comprimento, sepal_width = largura))
}
```



```
library(plumber)
```

```
data <- iris
kmeans_object <- kmeans(data, 3)
```

```
## Retorna o cluster correspondente de uma observação
## @param comprimento comprimento da sepala
## @param largura largura da sepala
## @post /pred
```

```
pred <- function(comprimento, largura) {
  predict(kmeans_object, newdata = data.frame(sepal_length = comprimento, sepal_width = largura))
}
```

Arquivo kmeans.R

```
p <- plumber::plumb('R/kmeans.R')  
p$run(port = 8888)
```



```
curl --data "comprimento=5.1&largura=3.5" "http://localhost:8888/pred"
```

FROM r-base:3.5.1

Imagem base do R

RUN apt-get update && apt-get install -y libcurl4-openssl-dev libssl-dev libxml2-dev libpq-dev

RUN install2.r plumber  
WORKDIR /usr/plumberR

Instalando o plumber e  
criando um diretório

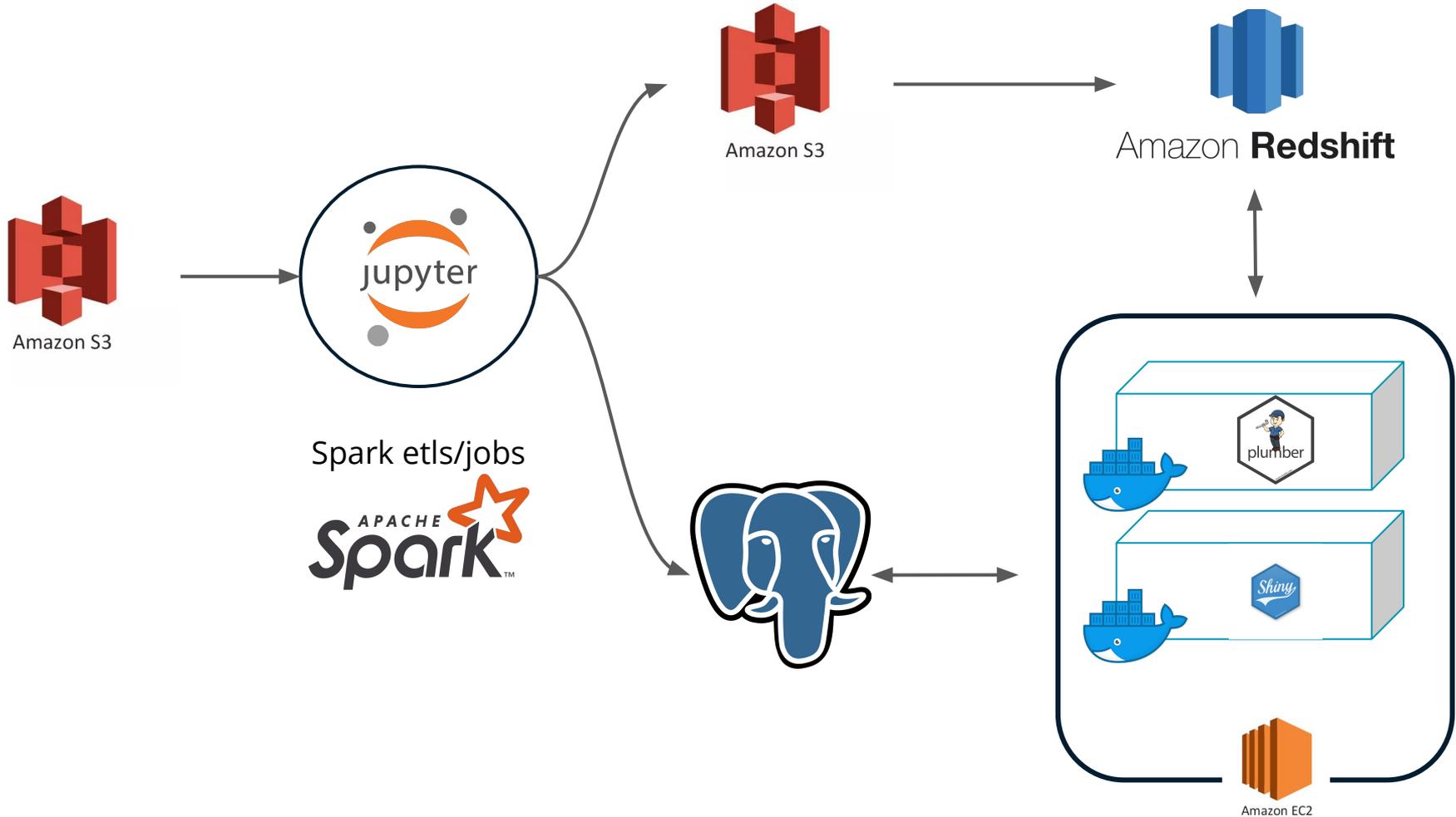
COPY kmeans.R /usr/plumberR

Copiando nosso arquivo  
para o diretório criado

EXPOSE 8000

ENTRYPOINT ["R", "-e", "pr <- plumber::plumb(commandArgs()[4]); pr\$run(host='0.0.0.0', port=8000)"]

CMD ["kmeans.R"]



# Vá mais longe!

- Banco:
  - SQL injections attack.
- Autenticação:
  - Pacote auth0 (Curso-R).
- Teste:
  - shinytest;
  - plotCaching.
- Deploy:
  - kubernetes.

# inloco

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