



Analytic
Health.



R in Production?

What R we going to talk about?

- 1. Introduction**
- 2. What is ‘production’?**
- 3. A look into our production process**
 - 1. Data gathering and data processing**
 - 2. Logging**
 - 3. Storage**
 - 4. Building products**
 - 5. Deployment**
 - 6. Monitoring**
- 4. Our tips**
- 5. Resources**



2011: Bsc Business Economics

2015: Msc Data Science



Analytic Health – who are we?



We develop intelligent and accessible technology which gives organisations the tools they need to accelerate innovation in healthcare.

Pharmly Analytics 

Pharmly Cloud Data  

🔗 <https://analytichealth.co.uk>



Veerle van Leemput
Managing Director & Head of Data Science



Greg Mills
Managing Director & Founder



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Head of Operations



What is Production?

Production

Your code is being **used** in a real-world situation, where people **rely upon** your code to function properly. If something goes wrong, this has **real life impact**.

Those people can be **users** and **developers**



+





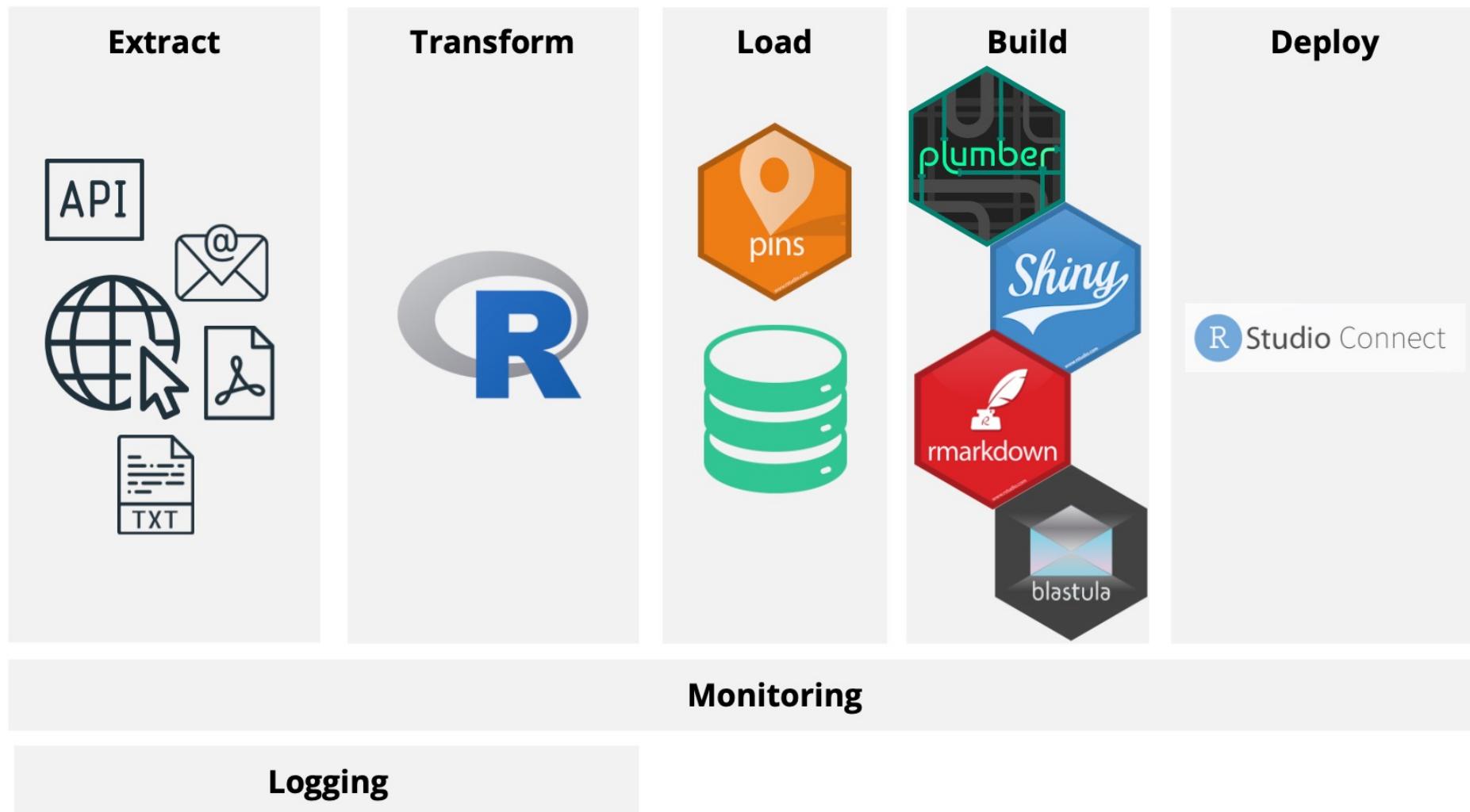
Organizing your environment: how
we make sure people can rely upon on
our code

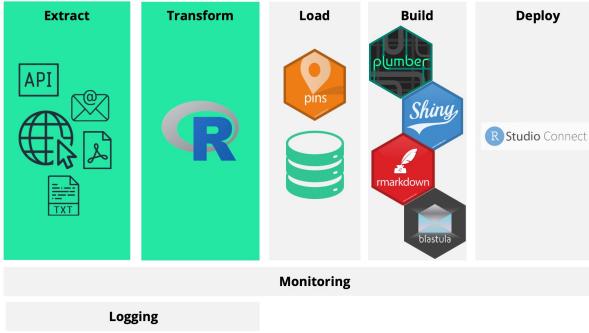
Our code should always be...

1. **Available**: our code (aka apps, ETL pipelines, reports) needs to be accessible at all times
2. **Validated**: mistakes in our ETL pipelines have big consequences, we validate the outcomes of our processes at all times
3. **Version controlled & monitored**: we know what's going on

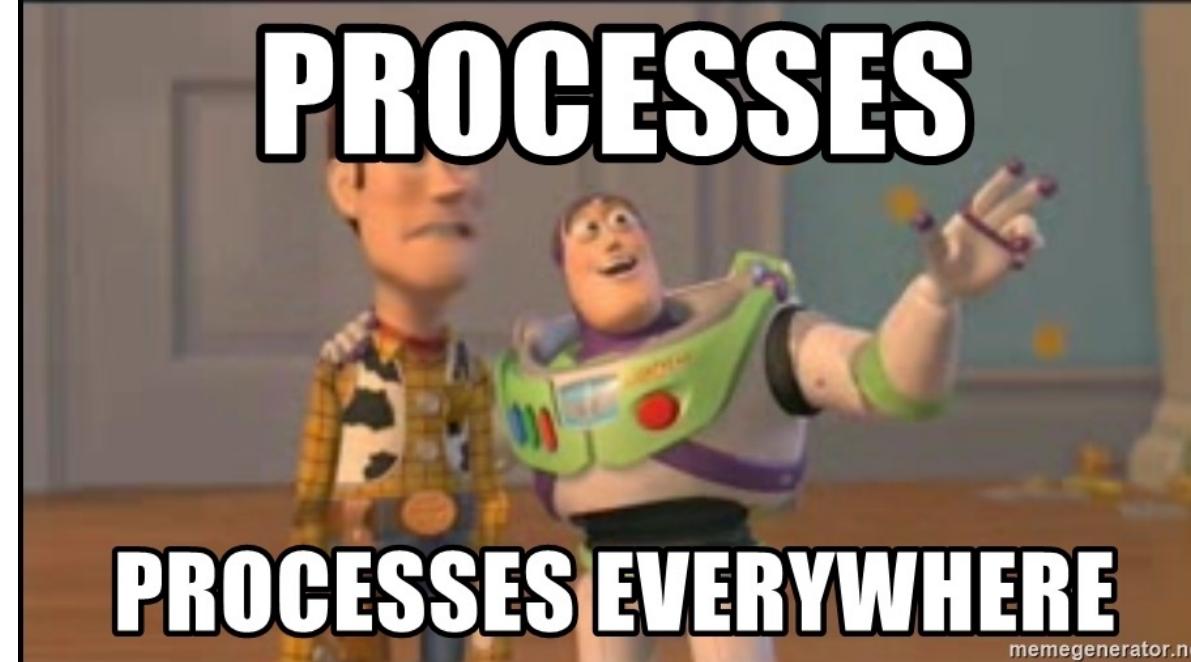


A look into our process



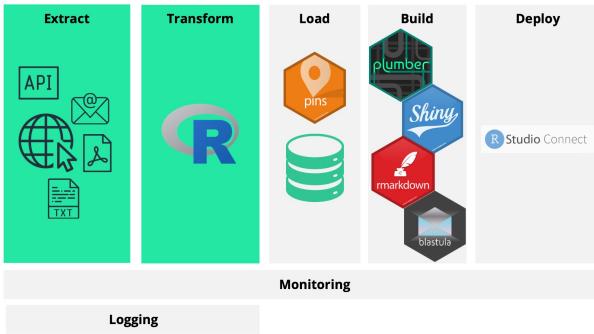


Data Gathering and Processing



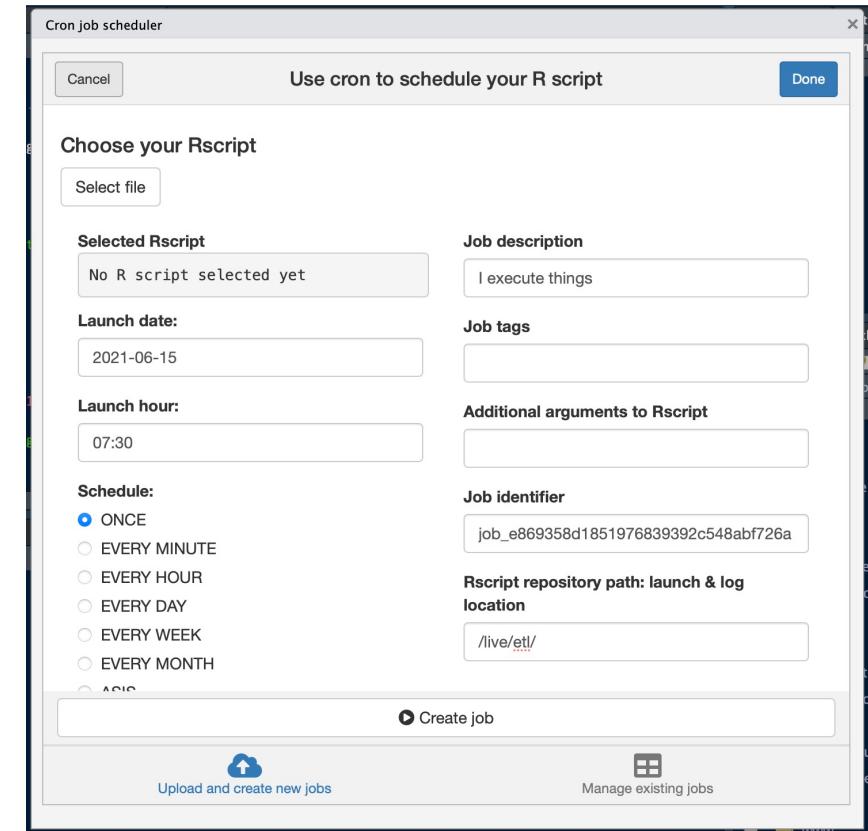
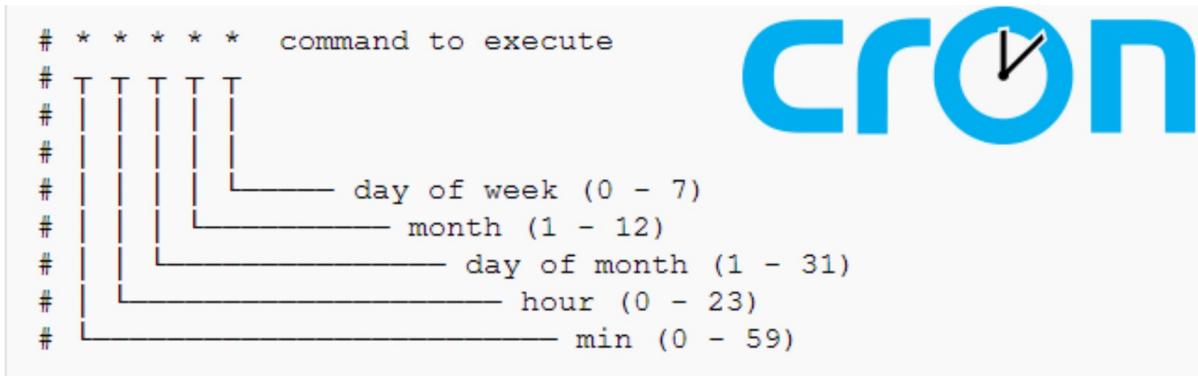
We have **32** ETL processes running in R

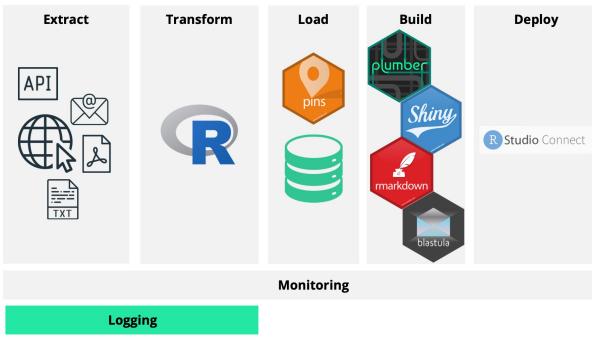




Data Gathering and Processing

cronR is your friend



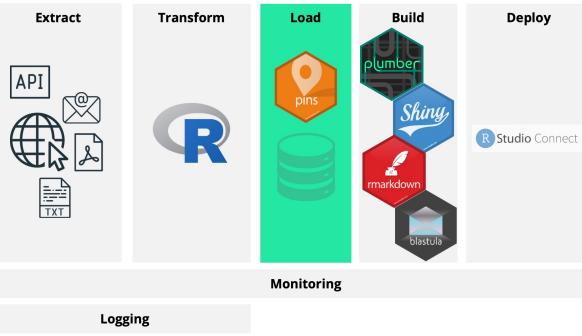


Logging

Make your logs valuable

- Execution time ⏳
- Which script was executed 📜
- Where problems occurred 👀

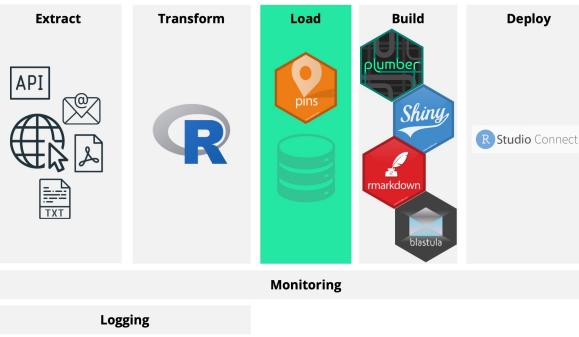




Storage

- AWS MySQL database
- Azure SQL Server databases
- Azure fileshare
- Pins





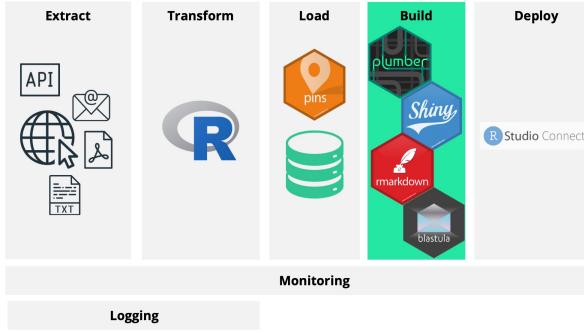
The beauty of pins



A **pin** can store **any resource**

- data.tables, data.frames, models, you name it!
- Share resources by publishing to **R Studio Connect**, GitHub, Azure, Google Cloud, S3, and more
- Great to use in Shiny apps
- It's fast





Plumber

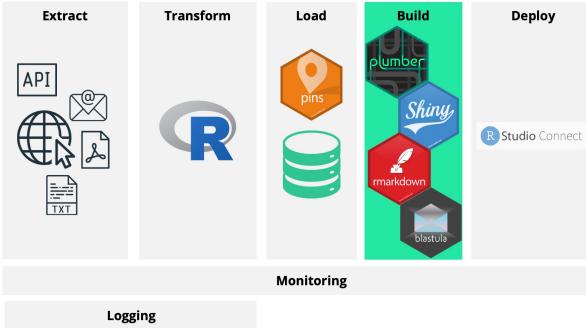


Plumber helps you to turn your R code into a **REST API**

REpresentational State Transfer Application Programming Interface

aka a way to retrieve information from the internet





Plumber



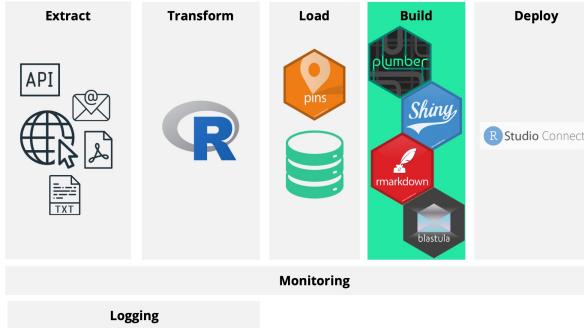
All you need to do:

1. Import the plumber package
2. Make a **plumber.R** file with your endpoints
3. Run your API

```
# plumber.R

## Echo back the input
## @param msg The message to echo
## @get /echo
function(msg="") {
  list(msg = paste0("The message is: '", msg, "'"))
}
```





Shiny

Interactive web applications

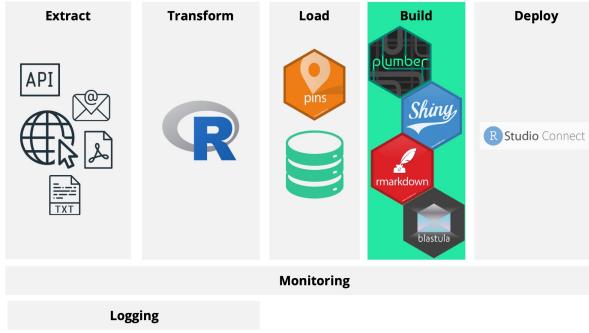


Keep your app updated by using **database connections** or **pins**, avoid sourcing of static assets

Manage your connections to the app:

- Manage database connections to your instance by using the **pool** package
 - Manage number of users allowed per session





R Markdown

Interactive reports

Send beautiful email reports with **blastula**

Can also use Shiny elements!

Convenient for communicating the most important changes each month/week



Extract

Transform

Load

Build

Deploy

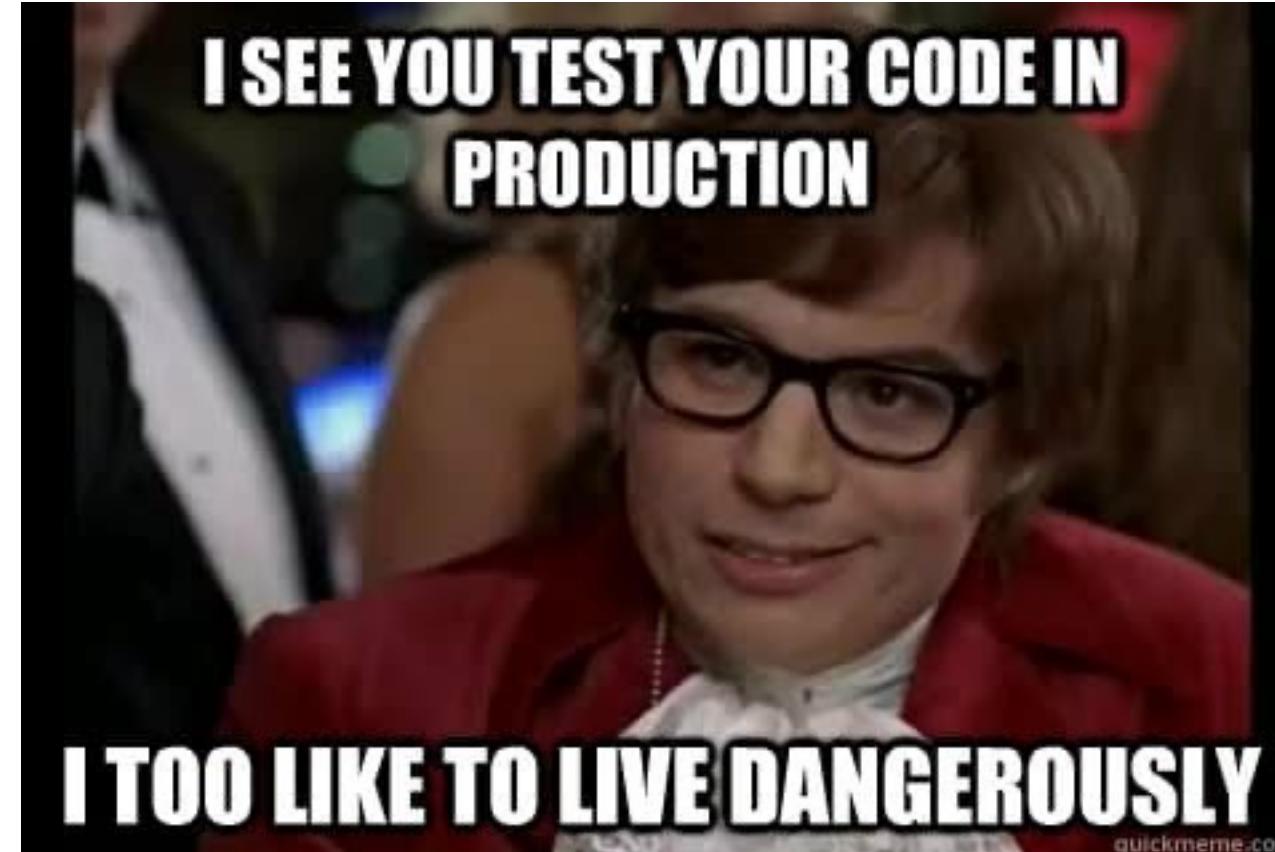


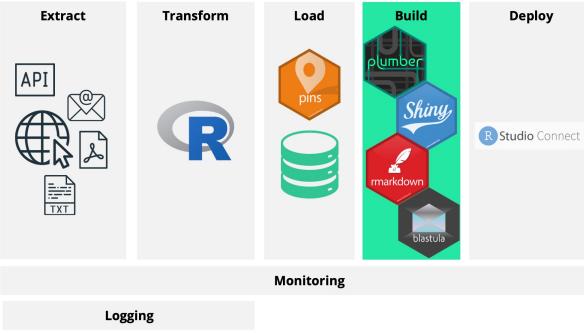
R Studio Connect

Monitoring

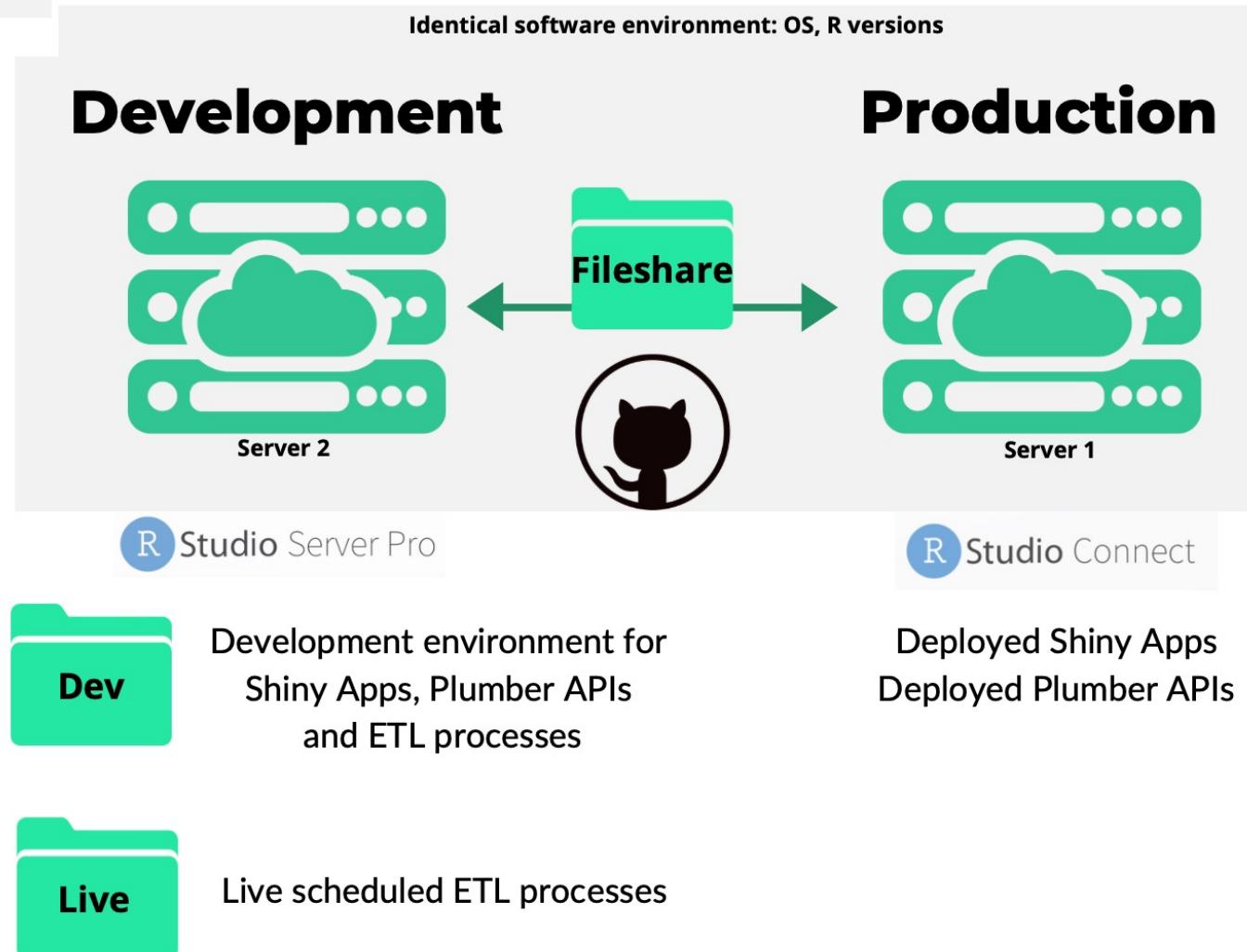
Logging

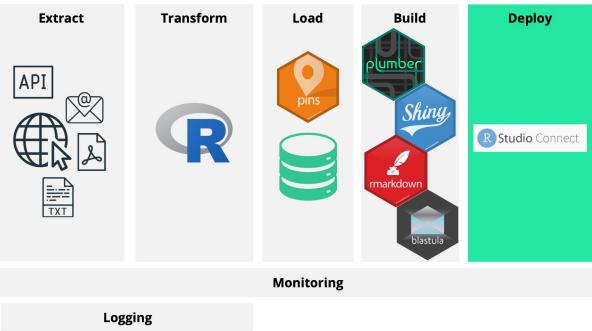
Separated environments





Separated environments





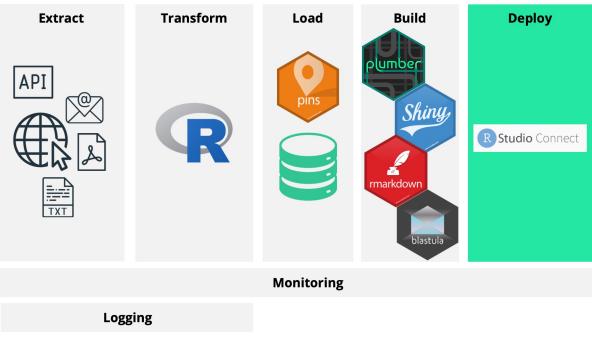
R Studio Connect



Hosting platform for all your R (and Python) related projects:
Applications (Shiny), Documents (R Markdown reports), pins, APIs
Makes it easy to distribute your products

Compared to shinyapps.io (for example):
Higher level of control
Higher level of customization



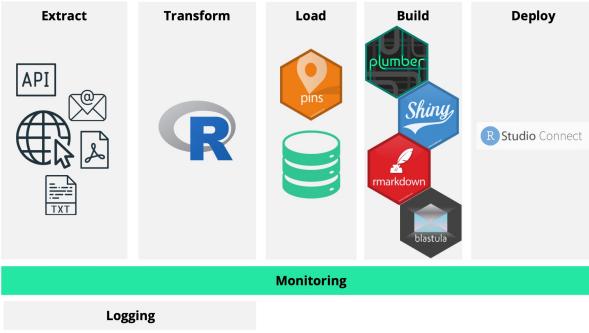


R Studio Connect



Let's take a look!





Waking up with our Data Pipeline Report

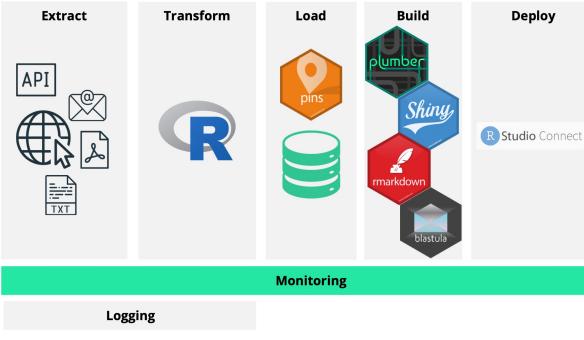
The screenshot shows a template for a Data Pipeline Report email:

- Header:** An Android icon followed by the title "Data Pipeline Report".
- Welcome Message:** "Welcome to the new Data Pipeline Email Report!"
- Section:** "Recent updates (last 3 days)"
- Table:** A table showing recent updates:

etl code	dataset	update
etl_030	hospital_england_scmd	Fri 18 Jun
etl_009	concessionary_update_1	Fri 18 Jun
etl_031	concessionary_report	Thu 17 Jun
etl_005	prescribing_england	Thu 17 Jun

Using R
Markdown
with Blastula





And... Our Server Monitor Report

Server Monitor Report



Hi Greg and Veerle,

This is the Server Monitor Report for Server 1 and Server 2. Both servers are checked for problems every day. You will only get an email when it is Monday, or when there are issues.

Runtime of report: Monday, June 21, 2021 at 6:01 AM (UTC).

Server logging

Not a date that is the same as the runtime of the report? Please check crontab!

server	latest_log_date
Server 1	Mon Jun 21 05:05:02 UTC 2021
Server 2	Mon Jun 21 05:04:02 UTC 2021

Cron job: executed

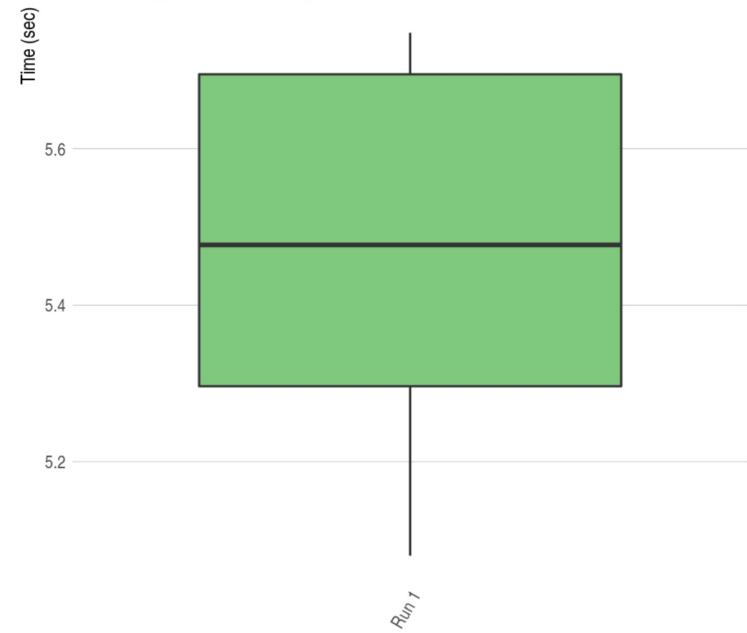
Disk space

server	partition	filesystem	percentage_used
Server 1	/	sdc1	68%
Server 1	/data-drive	sdb1	2%
Server 1	/mnt	sda1	1%
Server 2	/	sdc1	86%
Server 2	/mnt	sda1	1%
Not applicable	/ahshare1	//ahshare1	54%

Using **shincannon** to check if our apps are running accordingly

Pharmly

Event 1) Get: Homepage



event	time
Event 1) Get: Homepage	5.464333
Event 140) Start Session	0.017667
Event 141) Start Connection	0.000833
Event 144) Initialize Session	0.138167

Pharmly status: ok

Pharmly shincannon fully completed: yes





Our top tips

How to keep it manageable?

1. Version control: always, on everything 
2. Split your code up: smaller scripts are less overwhelming! 
3. Package your code: gather and maintain functions 
4. Fixed project set-up: consistency brings clarity 
5. Documentation: for yourself and for your fellow developers 
6. Logging: know what's going on! 
7. Monitoring: don't be surprised 



R in Production – yes you can!



Questions?

Let's keep in touch!



<https://www.linkedin.com/in/veerlevanleemput/>



Package overview & Resources

Mentioned packages & other resources

Packages

- cronR (<https://cran.r-project.org/web/packages/cronR/vignettes/cronR.html>)
- Pins (<https://pins.rstudio.com>)
- Plumber (<https://www.rplumber.io>)
- R markdown (<https://rmarkdown.rstudio.com>)
- Blastula (<https://pkgs.rstudio.com/blastula/>)
- Shiny (<https://shiny.rstudio.com>)
- Pool (<https://github.com/rstudio/pool>)
- Shincannon (<https://github.com/rstudio/shincannon>)

Other resources

- Engineering Production-Grade Shiny apps (<https://engineering-shiny.org>)
- R Studio Connect (<https://www.rstudio.com/products/connect/>)
- R Studio Server Pro (renamed to R Studio Workbench, <https://www.rstudio.com/products/workbench/>):

