	Zeppelin	Jupyter	RStudio	Plotly Dash
Core Experience				
Notebook Functionality	★ chart creator, interactive tables, dynamic forms.	Not much interactivity, but better UI than rmd. Obscure metadata features.	.rmd feels forced because it's in a text editor and you have to handwrite the cell markdown	Not for notebooks. Chart Studio is hard to use regardless.
Browser-based	Zepl or Apache-Zeppelin	Tree, Lab, or Hub	★ RStudio, Server Pro (same as desktop app)	Plot.ly Chart Studio
Desktop App	None	nteract.io	★ RStudio (native browser)	None
File Explorer	Just a list on main page	JupyterLab's left pane or /tree	★ Files pane	plot.ly/my_files
Config Backend in UI	partial solution, not reliable (also, conda UI not reliable)	UI settings not reliable (also, conda UI not reliable)	★ Packrat package mgmt (but people want renv)	N/A, not for running code
Publish to a Portal	Zepl (upload only, no push/ publish) (only note.json format, can't import .ipynb, but <u>converter</u> )	★ Google Colab interesting (upload ipynb to google drive)  ^ MSFT next?  JupyterHub (no commercial provider)	RStudio Connect (Shiny & .rmd are dynamic/ interactive, but .ipynb is static)	Plot.ly Dash (charts only, not notebooks. push to portal)  ^UPDATE: notebook apps!
		(upload only, no push/ publish)		
Dashboard Mode	Resizable (cell width=1-12)	jupyter/dashboards	★ <u>via R Shiny Dashboards</u>	Primarily a dashboard tool
Pluggable Themes	Requires editing source code	dunovank/jupyter-themes	★ In preferences menu	Only for dashboards
Extensibility				
Language Agnostic	★ Interpreters (reliable out of the box)	Kernels	R, Python via Reticulate	R, Python, Javascript
Plugins	★ <u>Helium</u> ( <u>slides</u> )	nbextensions + <u>UI Extensions Manager</u>	Tidyverse community releases.	Some React, js web component support
Deployment				
Install via Package Manager	many maven packages	\$ pip install jupyter jupyterlab \$ conda install jupyterlab	N/A	\$ pip install plotly Or \$ pip install dash
Install via Homebrew	\$ brew install apache-zeppelin	\$ brew install jupyter	\$ brew cask install rstudio	No mention of brew dash
Install via Docker	0.8.1 (needs work)	★ <u>all-spark-jupyter</u>	rocker/rstudio	/plotly is their internal tools
Deploy via Kubernetes	\$ helm install stable/zeppelin Only `Shiro` auth? Helm chart w Spark + Docs	★ JupyterHub ( <u>helm chart</u> )	RStudio Server Pro (no helm chart)	"Dash has a react/ flask app at its core," which can be deployed as a web service.
Dependencies	Conda manages NPM. No bridge to Zepl.	Conda manages NPM. Lab/ tree caused problems with node extensions and never got it fully working.	Just works as a standalone app out of the box.	Separate packages for plotly ad chart studio (of which there are multiple versions).
Rendering Notebooks				
Paired with Frontend Library	AngularJS interpreter	\$ npm install jupyter-react-js	★ R Shiny framework	React.js components
Renders in Github	<u>note.json doesn't render</u> But there is a <u>plugin</u> (broken).	★ipynb renders	.rmd does not render	Just a .json of chart config
MVC Webapp Frameworks	No integrations. Zeppelinhub viewer became Zepl	`nbviewer` is a standalone webapp on top of tornado, so people just link out to JupyterHub.	Hacky CMS approach w Django	★ Embed in Flask, Django (again, just graphs)
Integrations				
Pandas	★ UI Table	Just stylized tables	reticulate` (r) View(py\$DF)`	N/A, relies on ipython
Apache Spark	★ dedicated interpreters for Spark and Beam (Databricks appears to have forked zeppelin for their cloud)	`findspark` and manually managing `spark context`	Sparklyr (improves SparkR)	N/A
Plotting	★ reliable Matplotlib interpreter and automated dataframe plots	Unreliable Matplotlib	ggplot2 equivalent is reliable	Primarily a plotting library
Pluggable Data Sources	Zepl Data Sources	Manual connections	★ Connections tab in App	"Download SQL client"
Workflow tools	Apache Beam interpreter. (Groovy interpreter would be a good fit for nextflow)	pip airflow (Groovy kernel would be a good fit for nextflow)	(wow, just realized there is no async workflow package for R. made an SO <u>post</u> )	N/A

Machine Learning Lifecycle Tools

 $\begin{array}{c} \text{AWS} \\ \text{(aws-sagemaker-spark-sdk)}, \\ \underline{\text{H2O}} \end{array}$ 

★GCP (Colab, DataLab, Dataproc), AWS (~EMR), ★Azure (Notebooks)

★ Polyaxon, Kubeflow,

AWS (Sagemaker), GCP (AI

Platform), H2O

GCP (<u>cloudml package</u>), AWS ( Sagemaker... <u>EC2 + reticulate...</u> <u>pdocs recommend Jupyter</u>)

GCP (Dataproc), AWS

(marketplace), Azure

(marketplace)

Manual install

N/A

Cloud Providers GCP (Dataproc), AWS (EMR),

Azure (<u>HDinsight</u>)

## <u>SUMMARY</u>

- Zeppelin has the most notebook functionality and integrations.
- RStudio has the best overall experience.
- Jupyter has the most adoption/ biggest community.
- RStudio is introducing native Python scripts.
- JupyterHub has the best Kubernetes deployment. Whereas Zeppelin only mentions Shiro auth and RStudio is not fully converted yet.
- Jupyter dominates the data science ecosystem. I'd chalk this up to collaboration/ marketing w PyData community.
- Zeppelin has the best Spark support out of the box, including Apache Beam interpreters.
- Zeppelin has awesome graph database query/ visualization (Neo4j Cypher/ Bloom), which isn't even open source... very surprising.
- Jupyter's extensions are completely unreliable, whereas Zeppelin's work out of the box.
- Feels like Databricks forked Zeppelin and didn't contribute improvements back to master branch.
- **Azu**re is the only cloud provider that has launched a standalone notebook service. But the cloud providers support both Zeppelin and Jupyter as part of their services.
- Databricks notebooks have built-in UI features for MLflow.

## <u>OPPORTUNITIES</u>

- No notebooks have built-in UI features for workflows/ pipelines. Maybe it would be nice to track where
  results are stored and the metadata about the runs... similar to ML lifecycle?
- Is there room for working with deployment scripts for Docker/ Kubernetes CI/ CD? Is there a way to nano/vim into files on the local file system?