



# 2019 QBS Group 5

# YouBike Forecast

陳元昊、黃琮仁、古裕彥、張碩宏

# 1

## Get a Glimpse of the Data

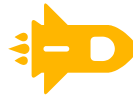
Data Preprocessing & Exploratory Data Analysis

# Data Preprocess



Rent Record

sta_id	rent_time	return_time
5	2016/1/10 13:51	2016/1/10 15:00
10	2016/1/21 16:46	2016/1/21 17:10
5	2016/1/14 15:38	2016/1/14 16:24
5	2016/1/16 16:45	2016/1/16 17:21
7	2016/1/1 08:11	2016/1/1 09:05
63	2016/1/6 17:41	2016/1/6 18:11



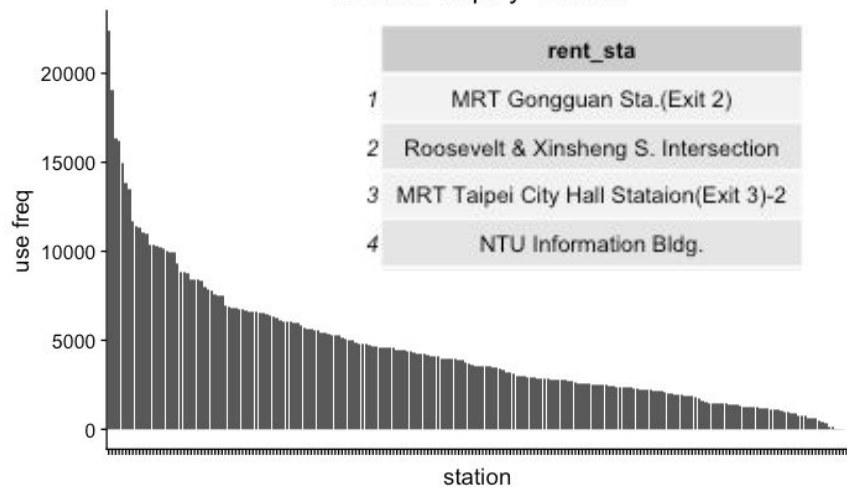
Station Summary

sta_id	period	demand
1	2016/1/1 00:00	0
	...	...
	2016/1/31 23:00	0
2	2016/1/1 00:00	0
	...	...
...	...	...

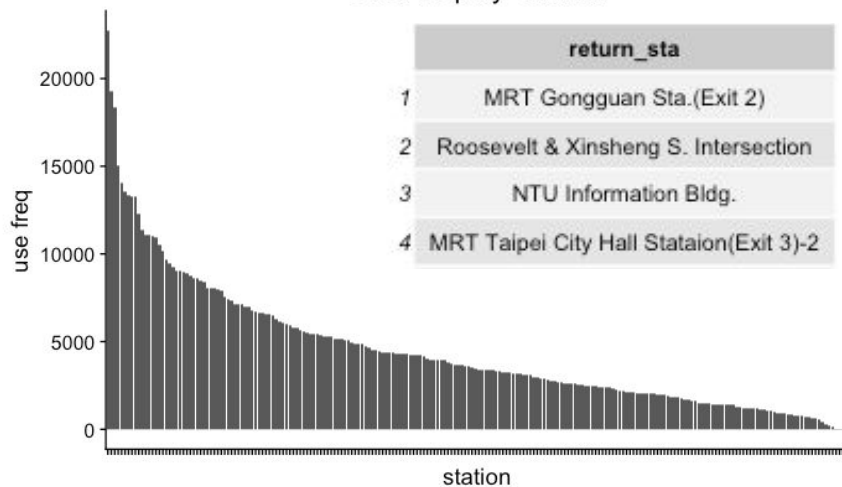
# EDA



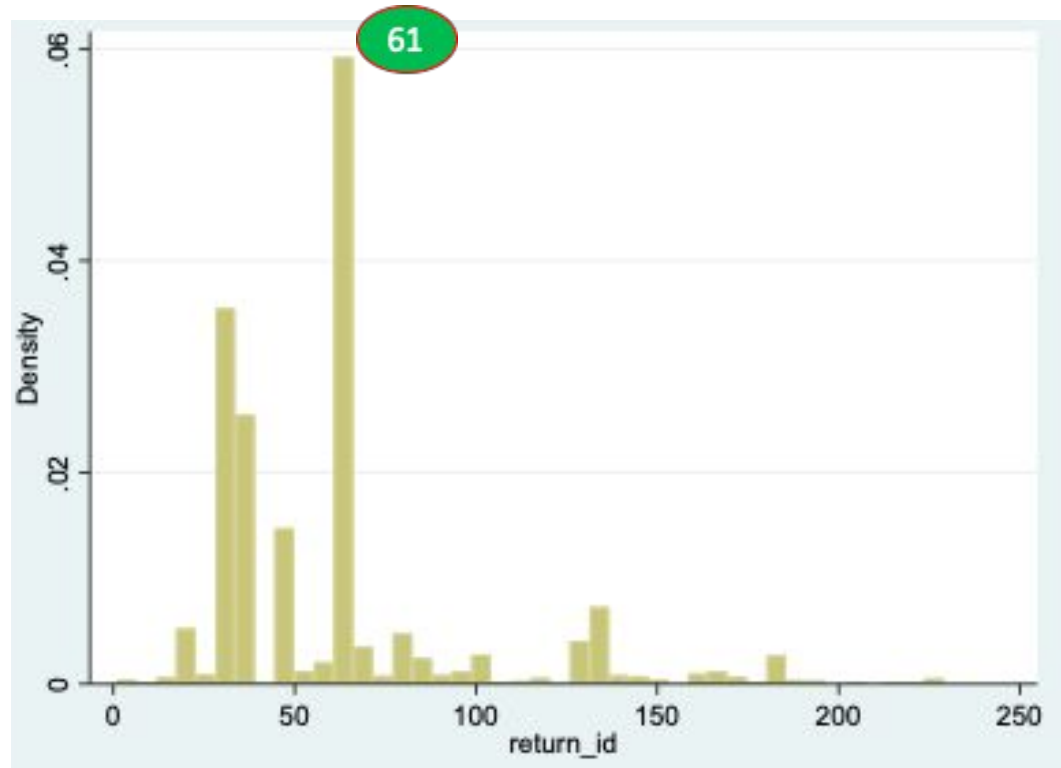
Return Freq. by Station



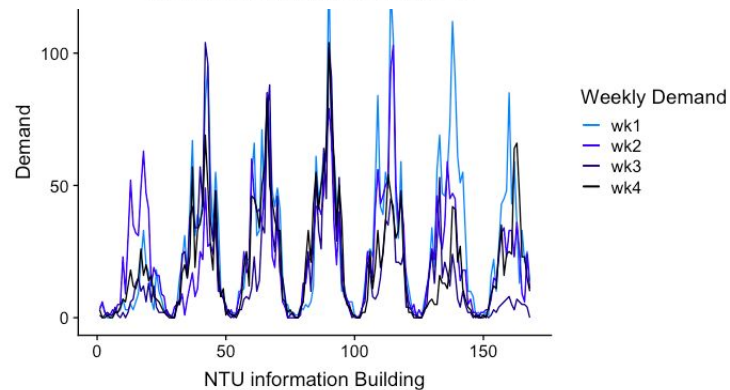
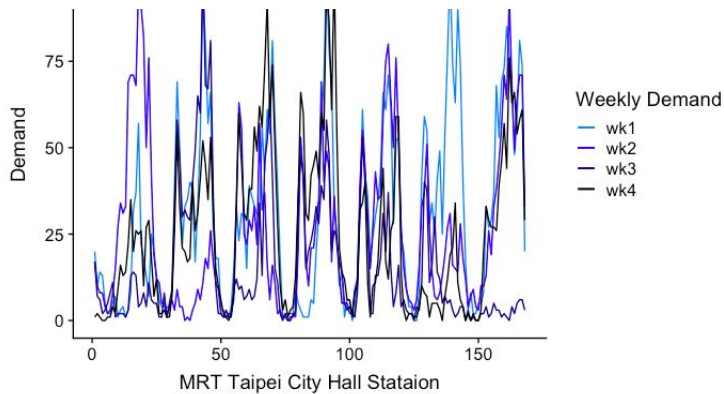
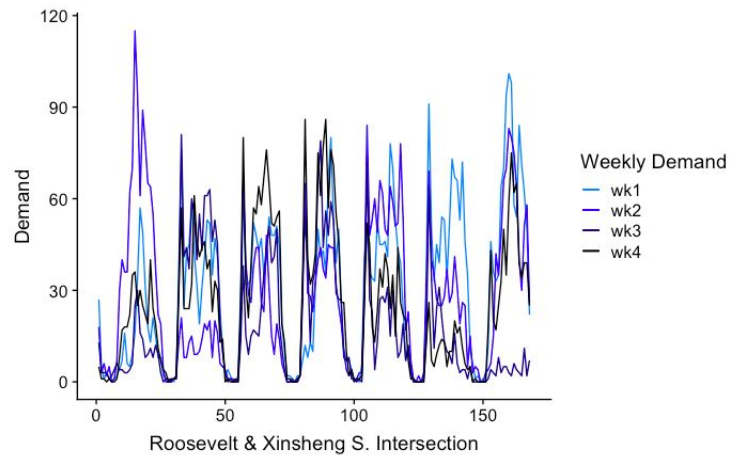
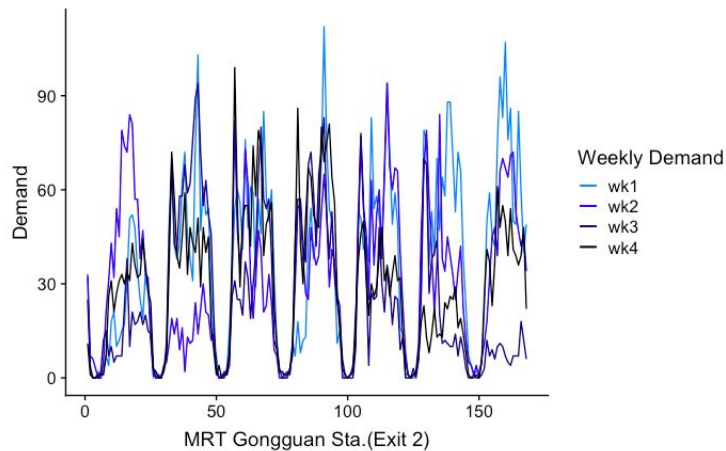
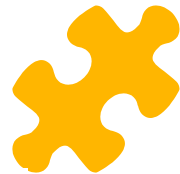
Use Freq. by Station



# EDA



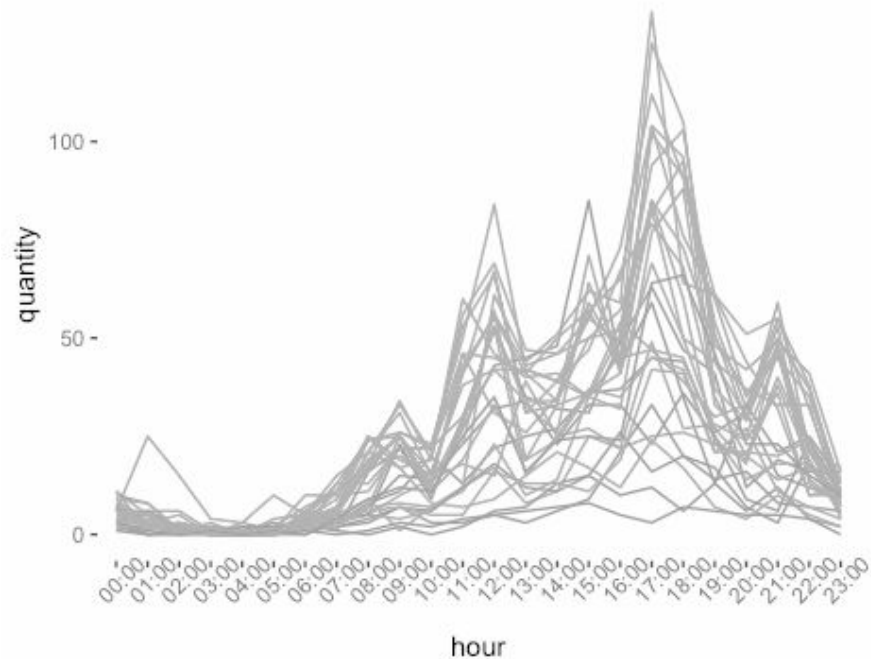
# EDA rent by week



# Build up our Models

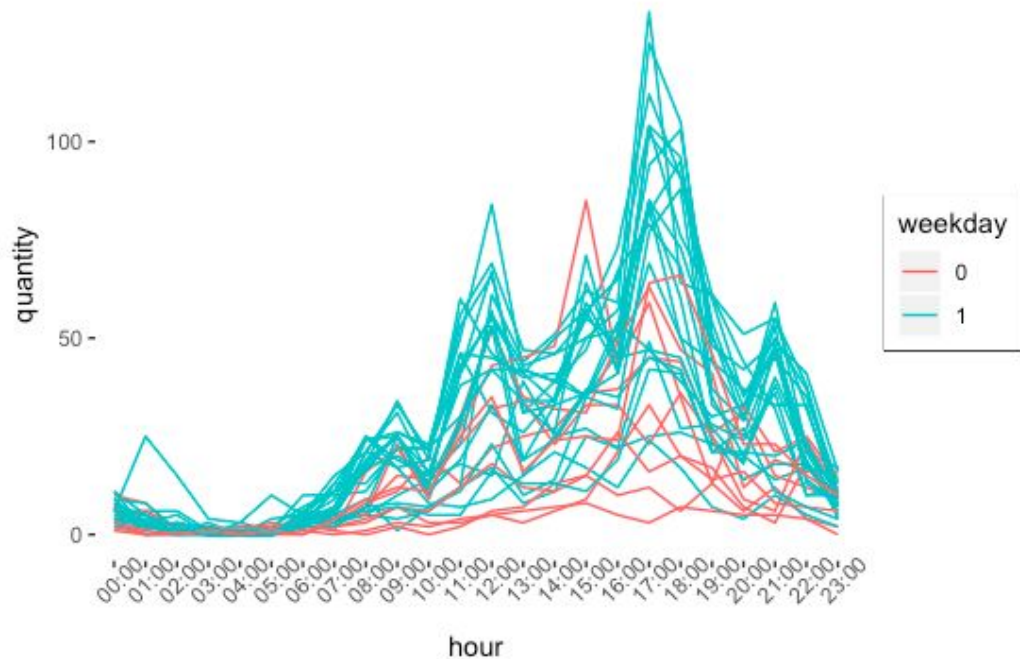
Autoregression Model & Hidden Markov Model

# Intuitive Model (1)

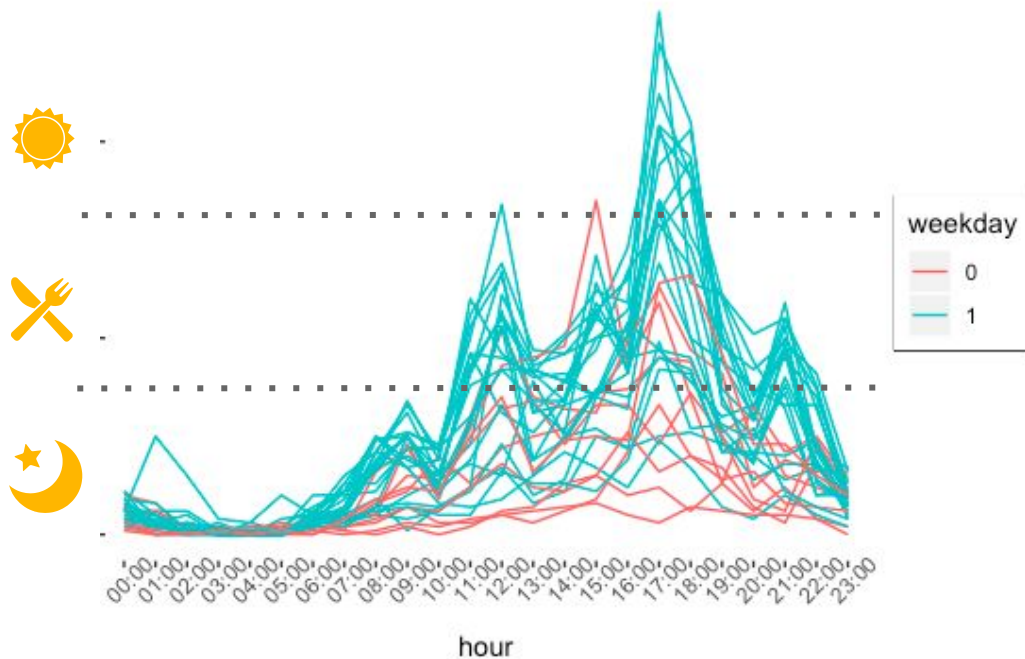
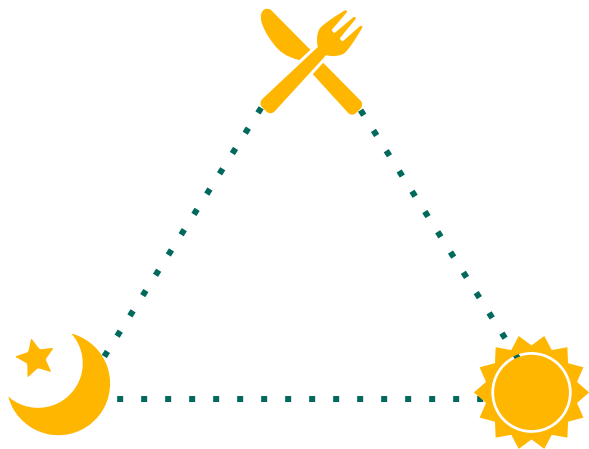




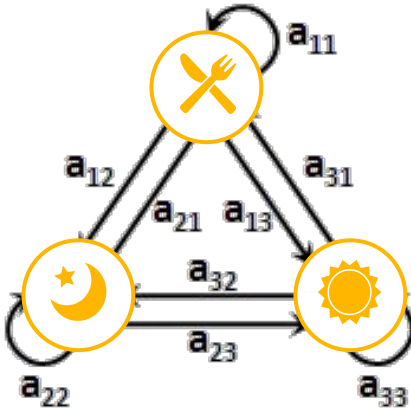
# Intuitive Model (1)



# Intuitive Model (1)

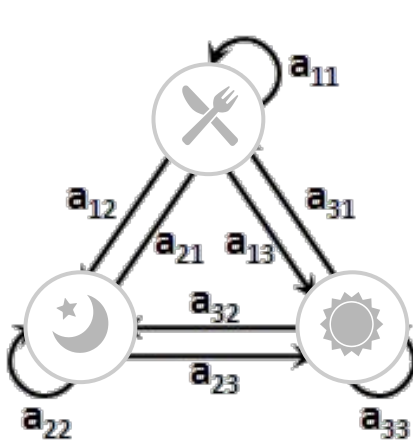


# HMM Model

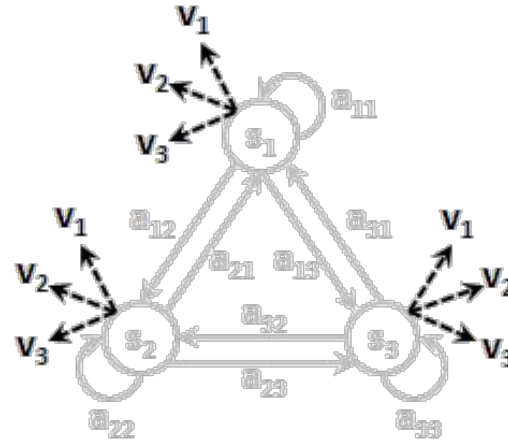


3 Different States

# HMM Model



3 Different States



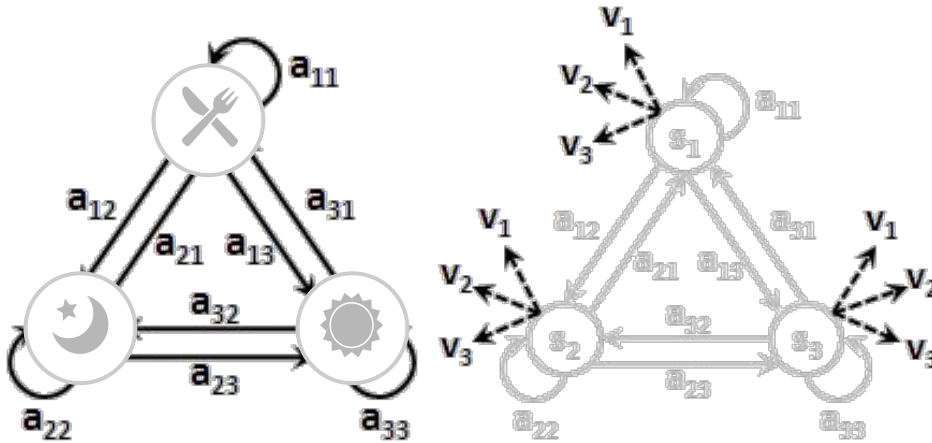
Demand(i) ~ Poisson(  $\lambda(i)$  )

$$\lambda = \alpha + \beta \times \text{weekday}$$

$$\alpha \sim \text{lognormal}(3, 1)$$

$$\beta \sim \text{lognormal}(1, 1)$$

# HMM Model





3 Different States

Demand(i) ~ Poisson(  $\lambda(i)$  )

$$\lambda = \alpha + \beta \times \text{weekday}$$

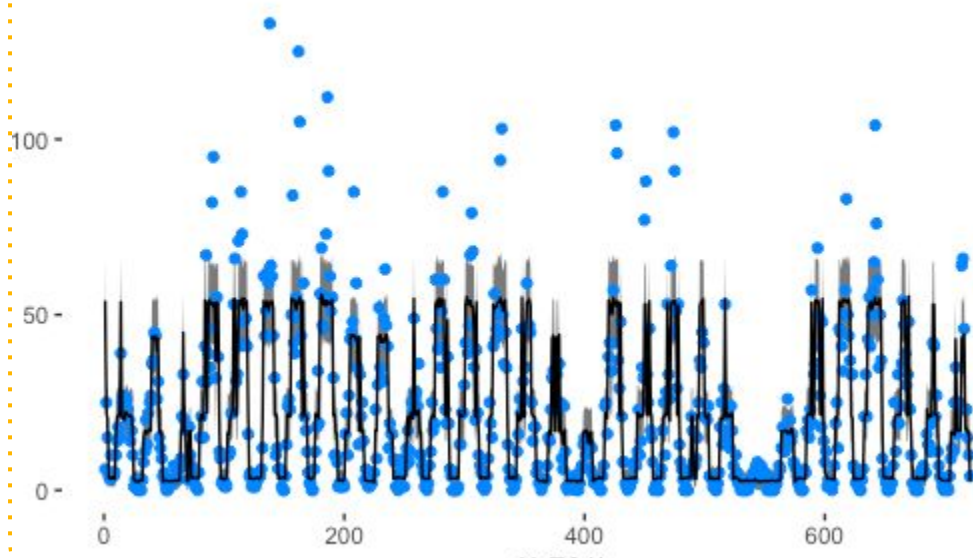
$$\alpha \sim \text{lognormal}(3, 1)$$

$$\beta \sim \text{lognormal}(1, 1)$$

Period	State	$\lambda$	Pred
2016/1/1 00:00		1	0
...	...	...	...
2016/1/3 10:00		30	32
...	...	...	...

Expected Outcome










# Backtest






Parameters

a[1]	12.26
a[2]	1.90
a[3]	34.17
bp[1]	4.44
bp[2]	0.75
bp[3]	9.63

# Train/Test Split<sub>(1)</sub>

		week1	week2	week3
Mon.	00:00			
	...	...	...	...
	08:00			
Tue.	...	...	...	...
	00:00			

MODE

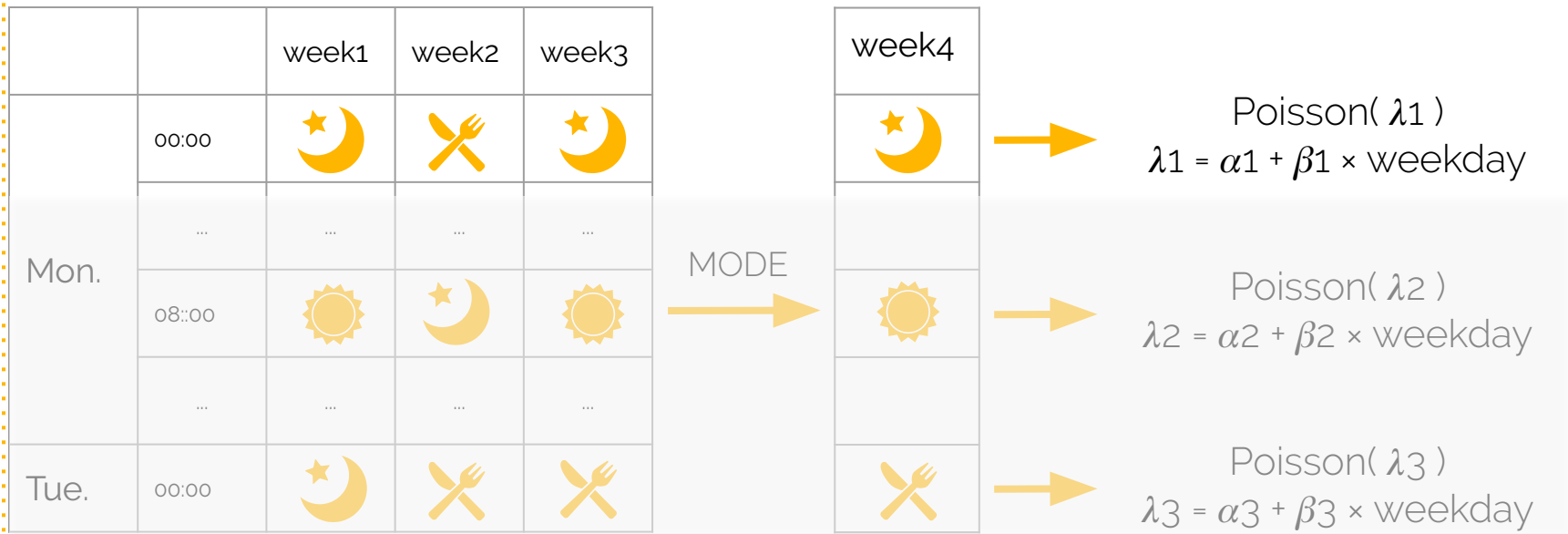
week4




Poisson(  $\lambda_1$  )  
 $\lambda_1 = \alpha_1 + \beta_1 \times \text{weekday}$

Poisson(  $\lambda_2$  )  
 $\lambda_2 = \alpha_2 + \beta_2 \times \text{weekday}$

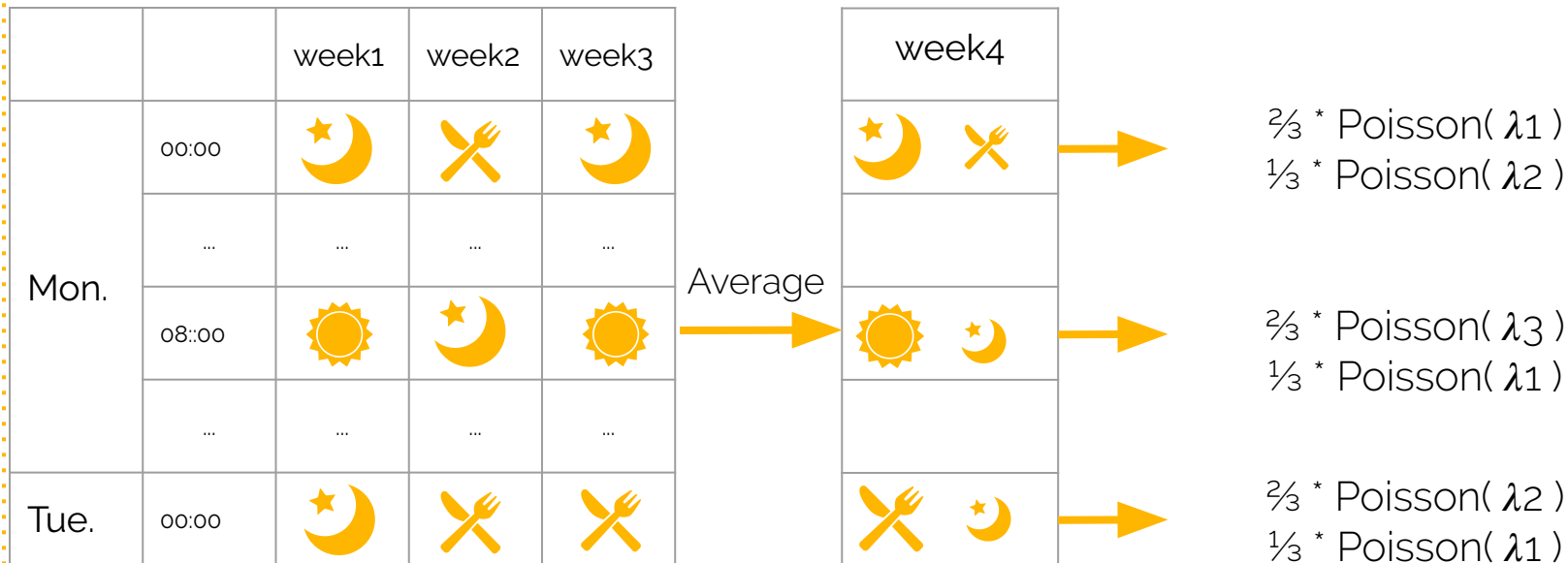
Poisson(  $\lambda_3$  )  
 $\lambda_3 = \alpha_3 + \beta_3 \times \text{weekday}$

# Train/Test Split<sub>(1)</sub>

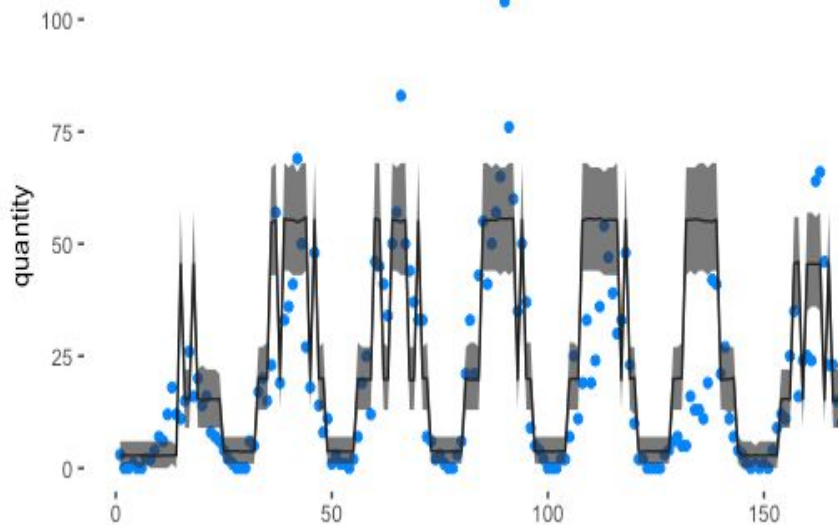




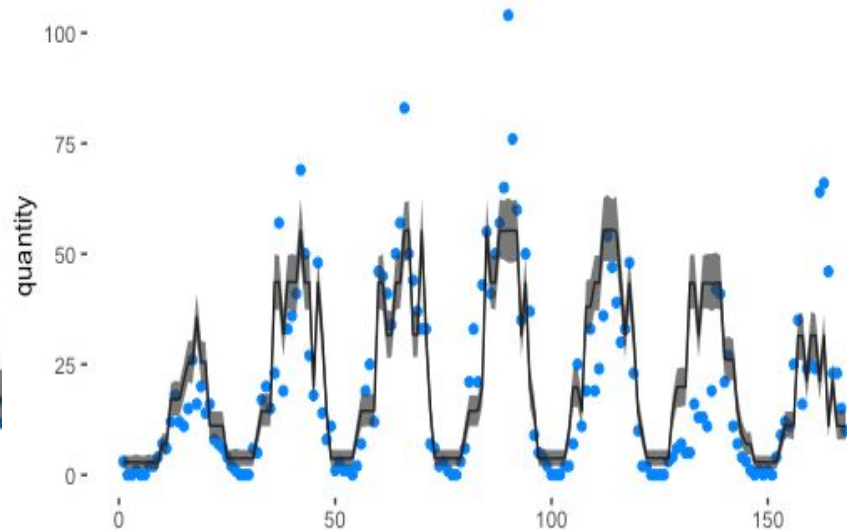
# Train/Test Split<sub>(2)</sub>



# Comparison



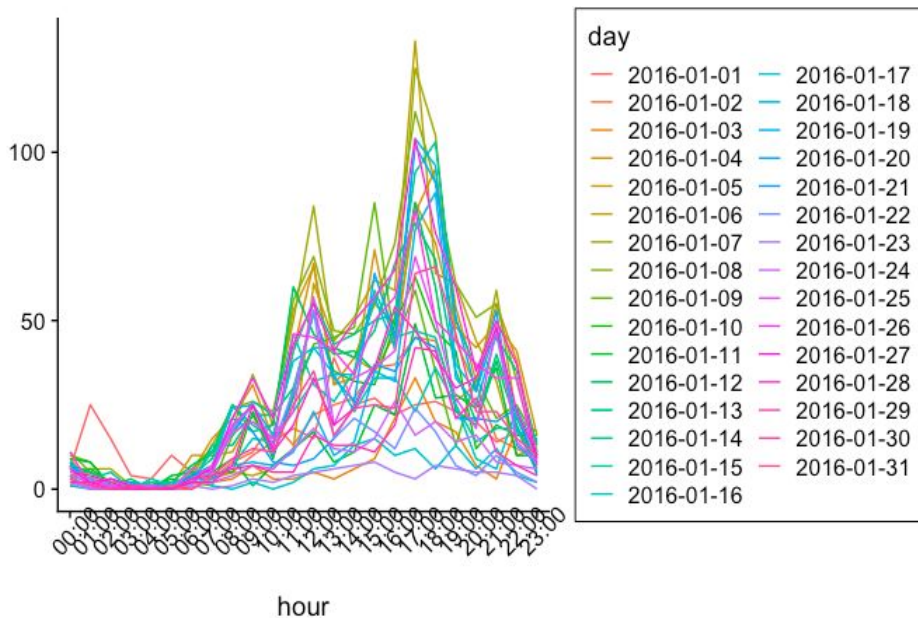
Mode Prediction  
RMSE = 14.96



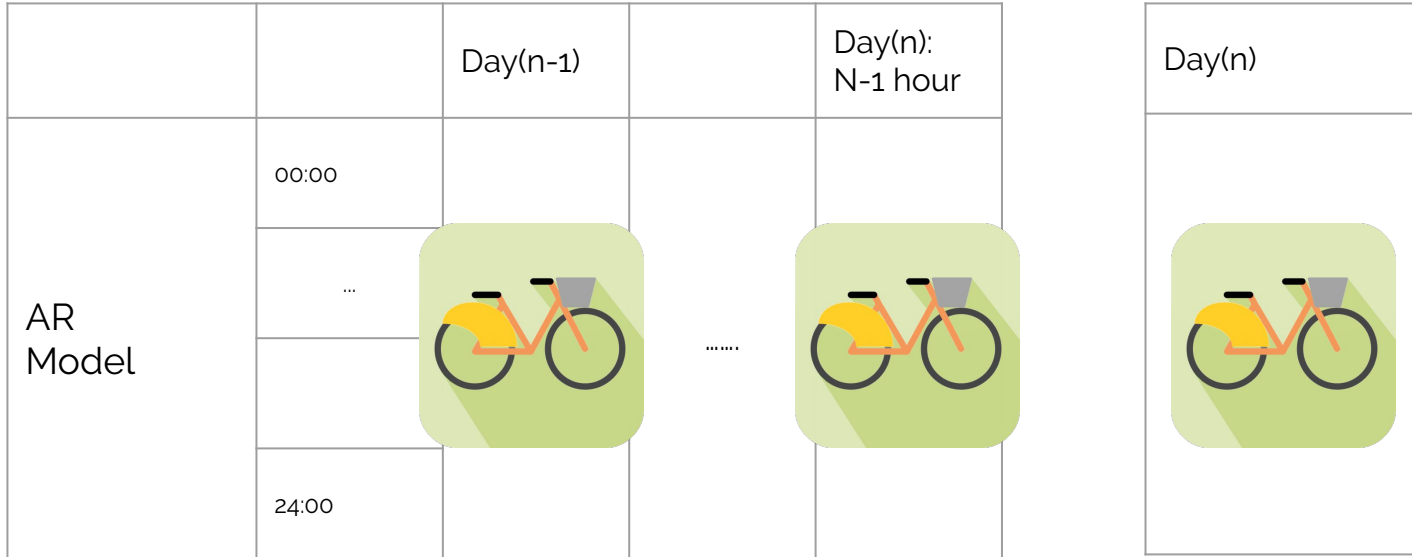
Average Prediction  
RMSE = 11.81



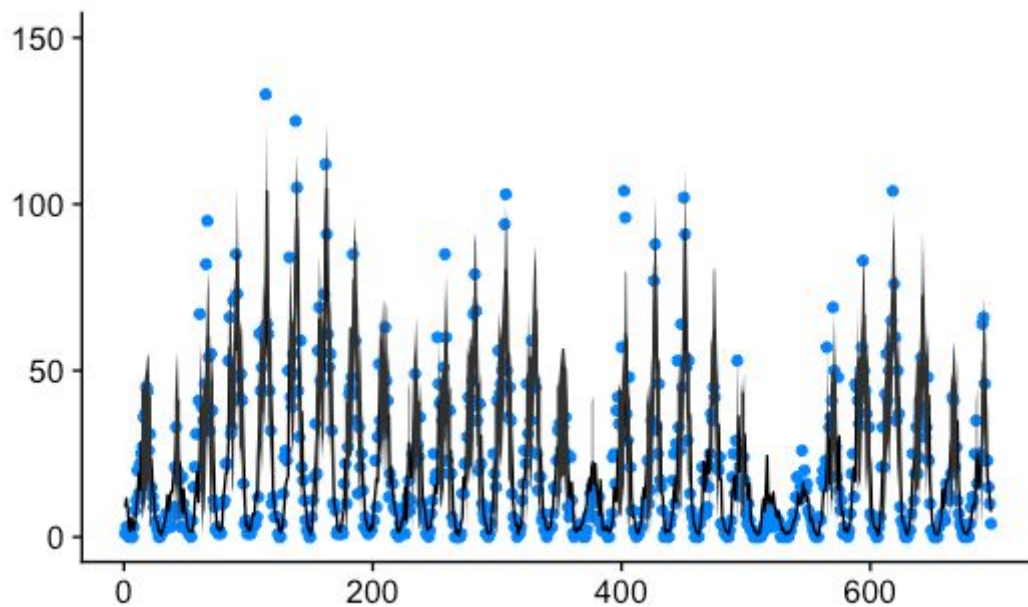
# Intuitive Model (2)



# AR Model



# Backtest

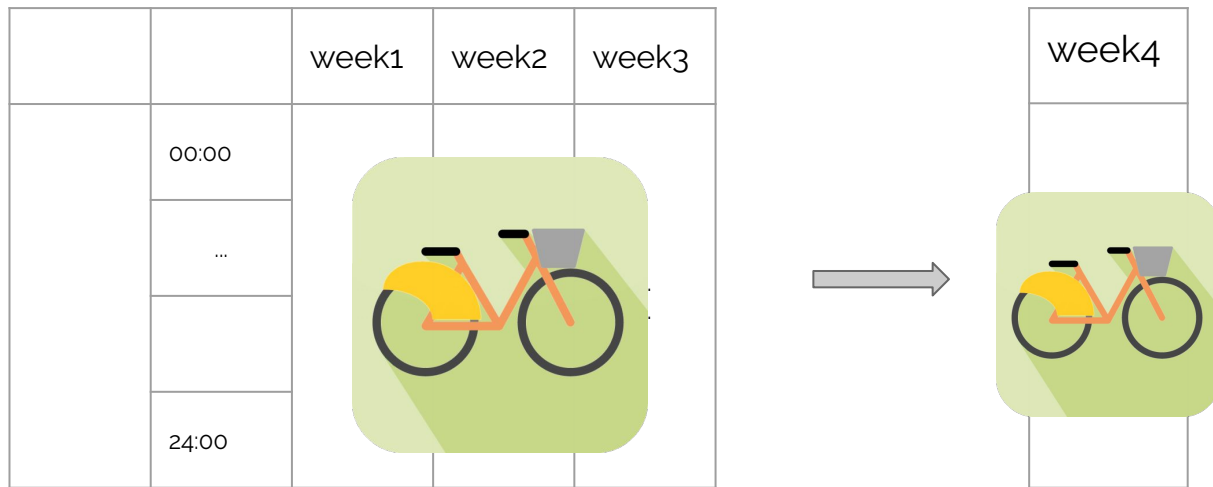


Parameters

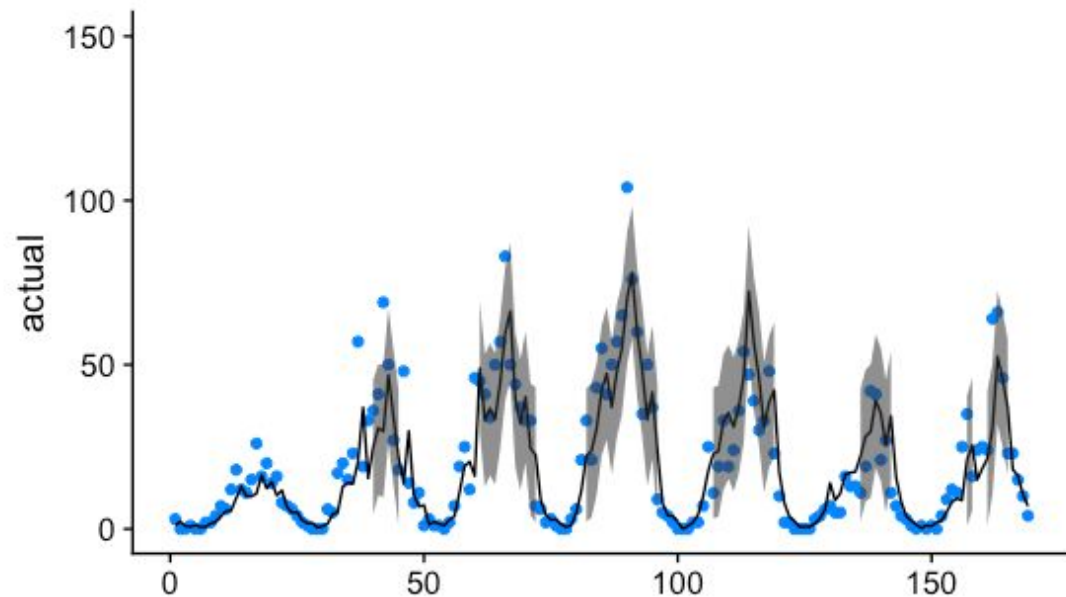
alpha	0.87
beta	0.55
beta2	0.40
sigma	12.09

Mode Prediction  
RMSE = 12.07

# Train/Test Split

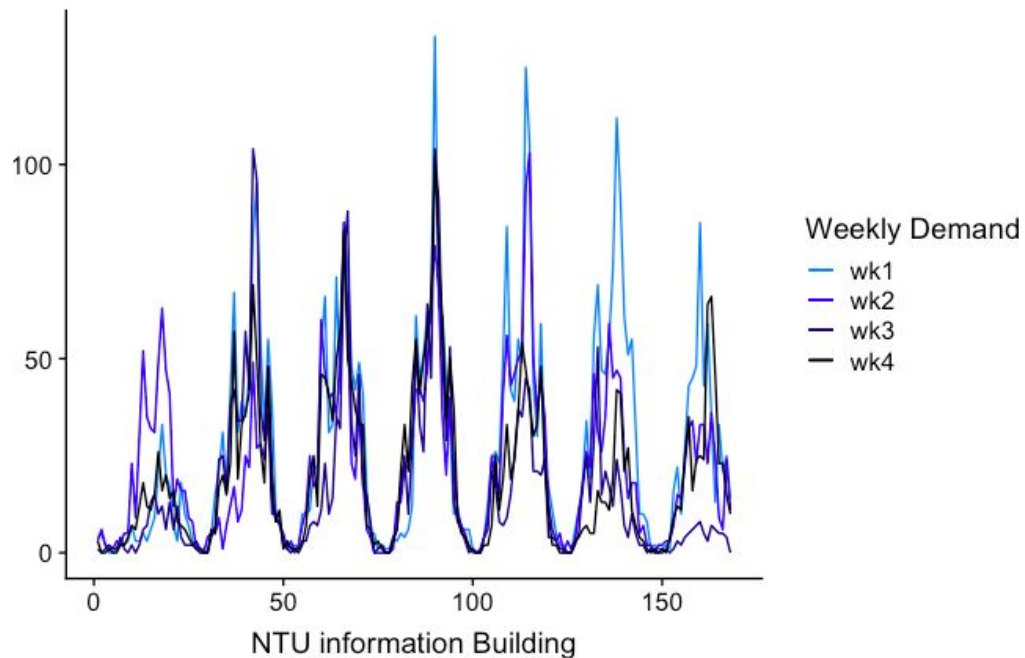


# Pred. Result



Prediction  
RMSE = 10.24

# Future Improvement

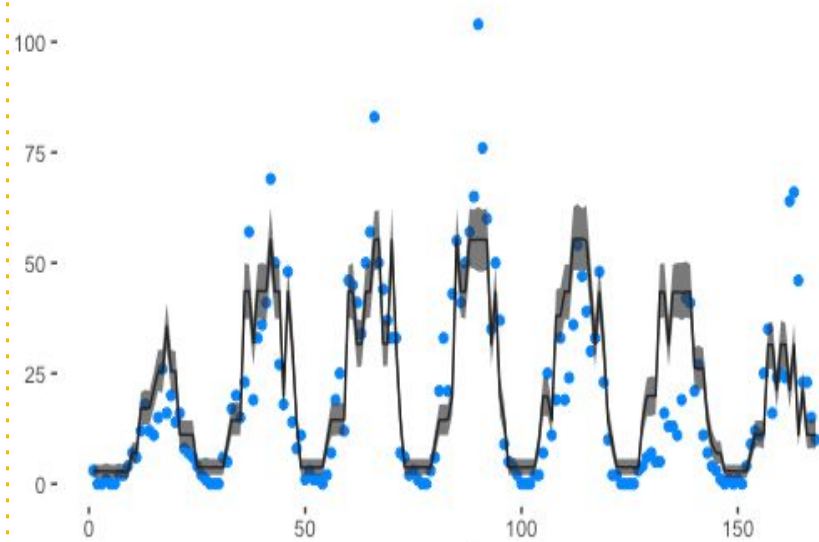




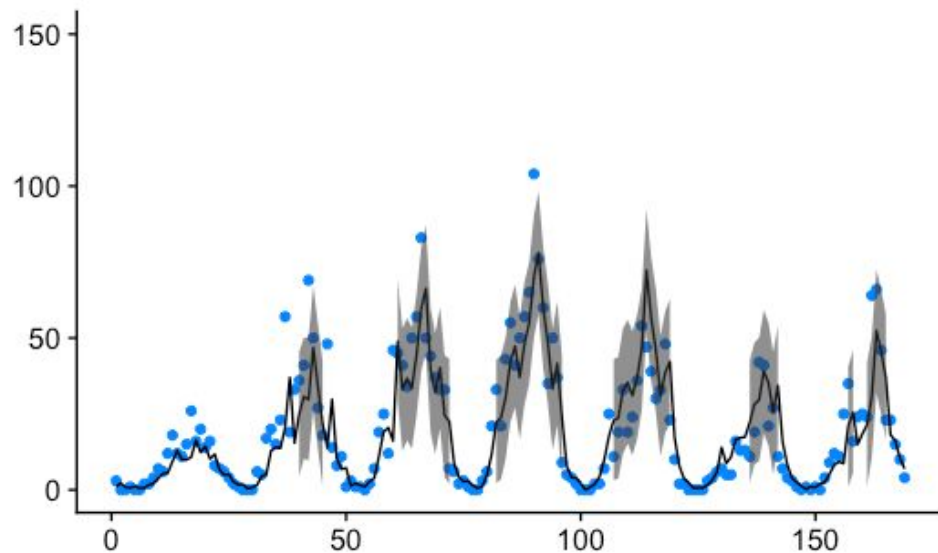
## Application in Reality

Out of "bike" Alert System

# Model Comp.

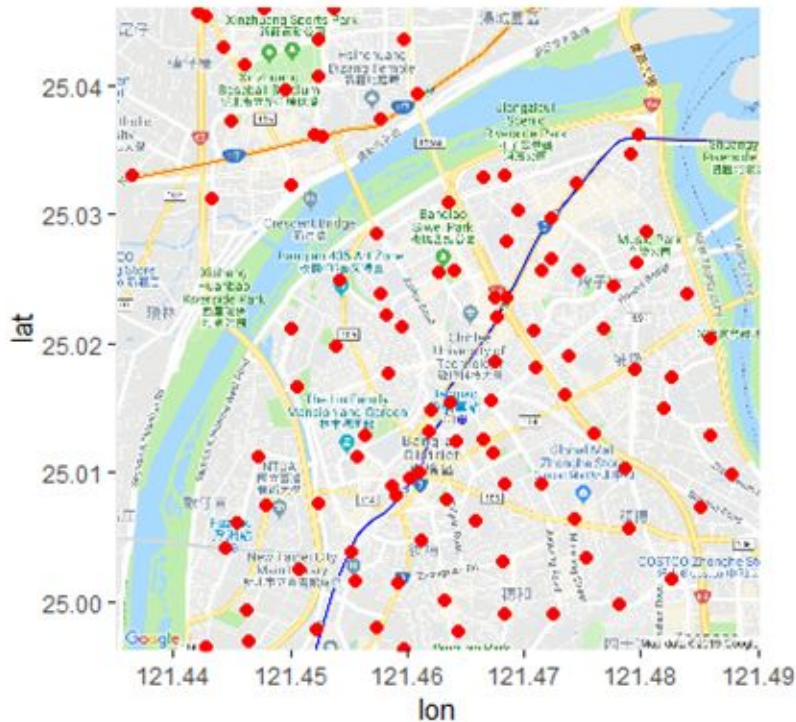
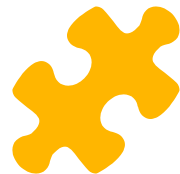


HMM with Avg Prediction



Autoregressive

# Location





*Quotations are commonly  
printed as a means of  
inspiration and to invoke  
philosophical thoughts from the  
reader.*



# You can also **split** your content

## White

Is the color of milk and fresh snow, the color produced by the combination of all the colors of the visible spectrum.

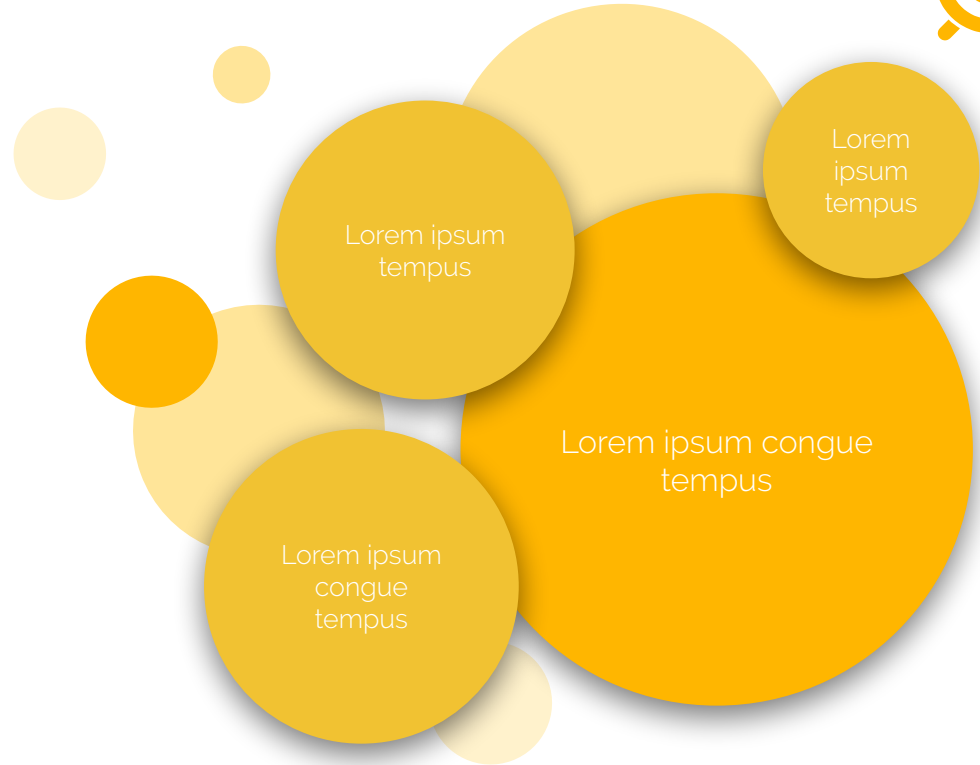
## Black

Is the color of coal, ebony, and of outer space. It is the darkest color, the result of the absence of or complete absorption of light.



**Want big impact?  
Use big image.**

# Use **diagrams** to explain your ideas





# And tables to **compare** data

	A	B	C
Yellow	<b>10</b>	<b>20</b>	<b>7</b>
Blue	<b>30</b>	<b>15</b>	<b>10</b>
Orange	<b>5</b>	<b>24</b>	<b>16</b>



# Maps





# 89,526,124

Whoa! That's a big number, aren't you proud?



**89,526,124\$**

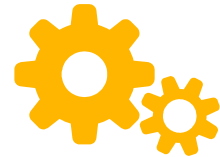
That's a lot of money

**185,244 users**

And a lot of users

**100%**

Total success!



# Our process is easy



first

## Lorem Ipsum

Lorem ipsum dolor sit amet,  
consectetur adipiscing.



second

## Sit Amet

Lorem ipsum dolor sit amet,  
consectetur adipiscing.



third

## Donec Ultrices

Lorem ipsum dolor sit amet,  
consectetur adipiscing.



last

## Litora

Lorem ipsum dolor sit amet,  
consectetur adipiscing.



# Let's **review** some concepts

## Yellow

Is the color of gold, butter and ripe lemons. In the spectrum of visible light, yellow is found between green and orange.

## Blue

Is the colour of the clear sky and the deep sea. It is located between violet and green on the optical spectrum.

## Red

Is the color of blood, and because of this it has historically been associated with sacrifice, danger and courage.

## Yellow

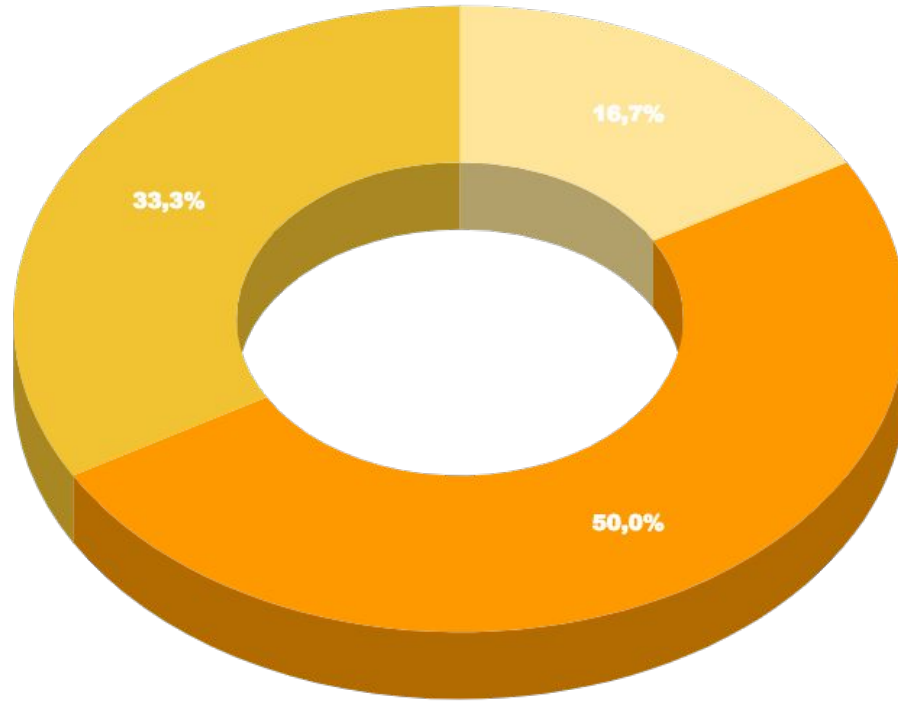
Is the color of gold, butter and ripe lemons. In the spectrum of visible light, yellow is found between green and orange.

## Blue

Is the colour of the clear sky and the deep sea. It is located between violet and green on the optical spectrum.

## Red

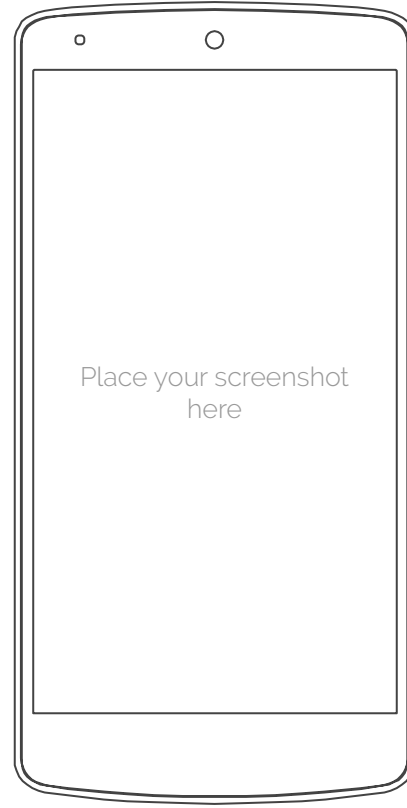
Is the color of blood, and because of this it has historically been associated with sacrifice, danger and courage.



You can insert graphs from [Google Sheets](#)

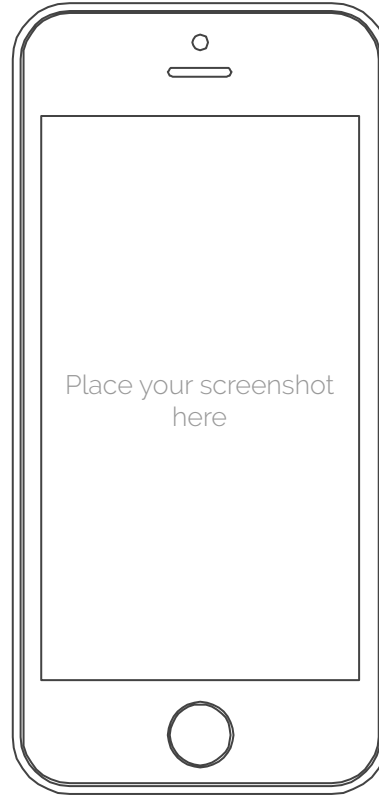
# Android project

Show and explain your web, app or software projects using these gadget templates.



# iPhone project

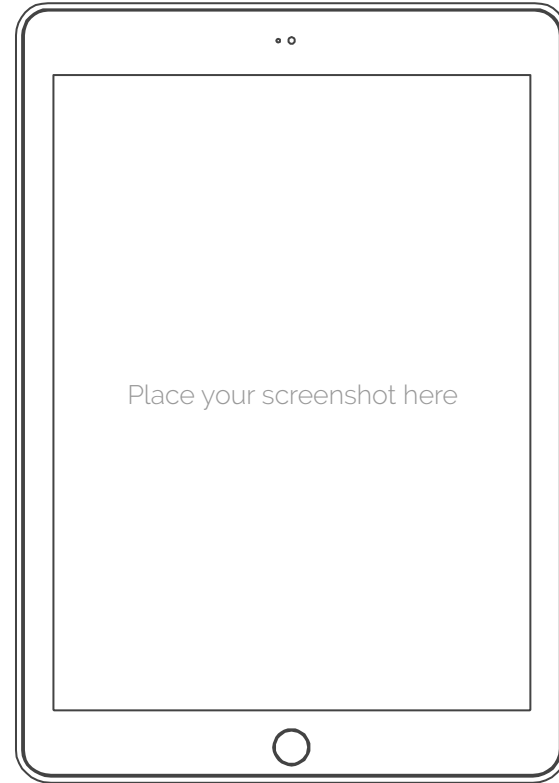
Show and explain your web, app or software projects using these gadget templates.





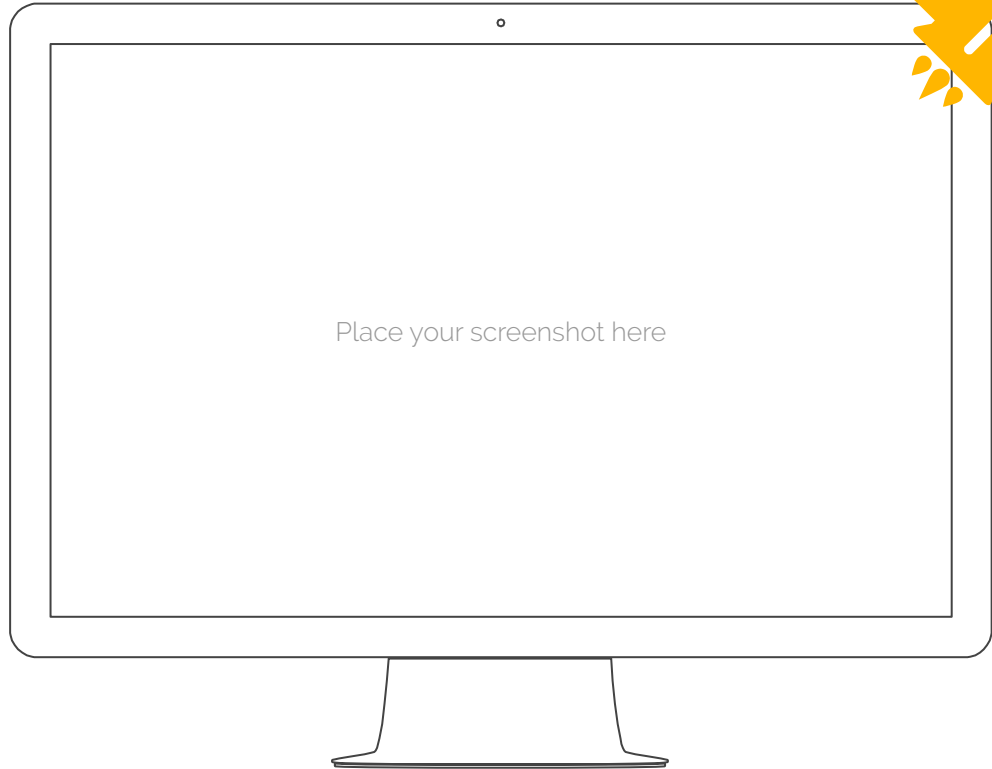
# Tablet project

Show and explain your web, app or software projects using these gadget templates.



# Desktop project

Show and explain your web, app or software projects using these gadget templates.





# Thanks!

Any questions?

You can find me at @username & user@mail.me



# Credits

Special thanks to all the people who made and released these awesome resources for free:

- Presentation template by [SlidesCarnival](#)
- Photographs by [Unsplash](#)



# Presentation design

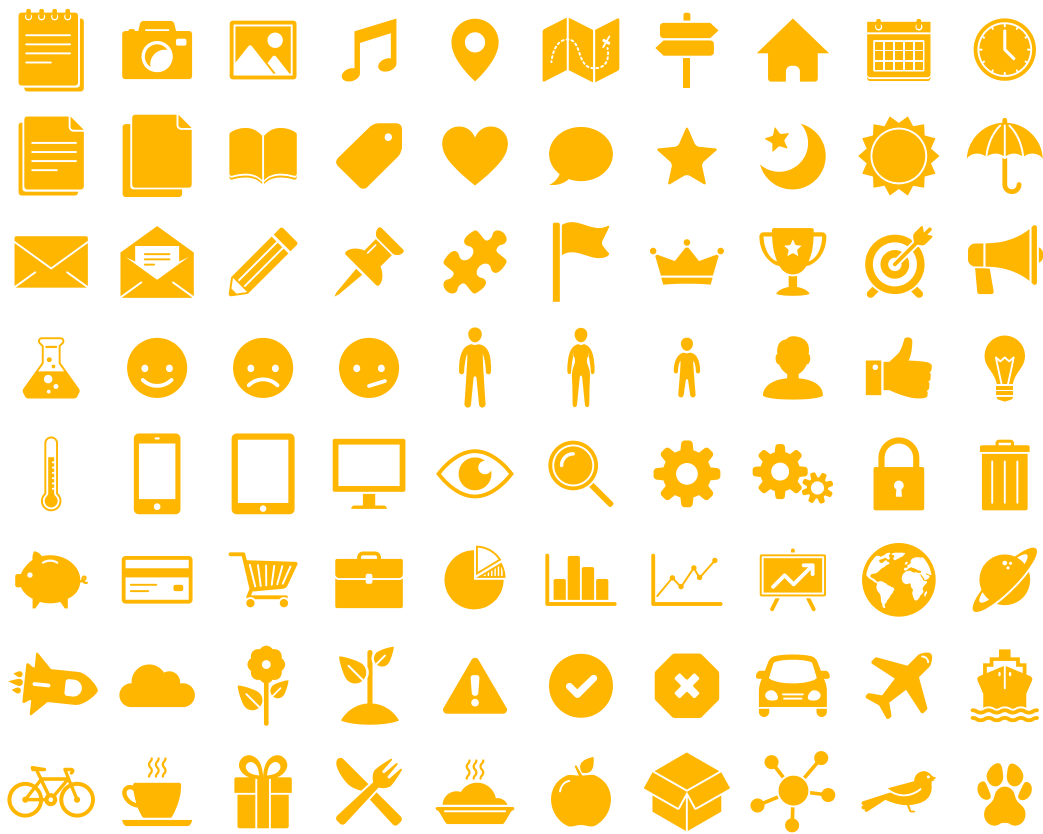
This presentation uses the following typographies:

- Titles: Raleway ExtraBold
- Body copy: Raleway Light

You can download the fonts at

<https://www.fontsquirrel.com/fonts/raleway>

You don't need to keep this slide in your presentation. It's only here to serve you as a design guide if you need to create new slides or download the fonts to edit the presentation in PowerPoint®



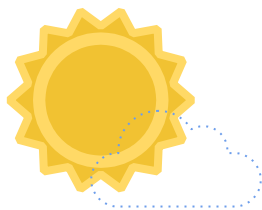
SlidesCarnival icons are editable shapes.

This means that you can:

- Resize them without losing quality.
- Change fill color and opacity.
- Change line color, width and style.

Isn't that nice? :)

Examples:



Now you can use any emoji as an icon!  
And of course it resizes without losing quality and you can change the color.

How? Follow Google instructions  
<https://twitter.com/googledocs/status/730087240156643328>



and many more...