



Renewable Energy Forecast Project

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Agenda

- Project background
- Data preparation
- Exploratory Data Analysis
- Models
- Final model and predictions



Project background

- Climate change is endangering our life
- Finding reliable renewable energy becomes a crucial step
- Rising of wind farms
- Our client: utility company



Data Preparation

- Impute values (na.interpolation)
- Aggregation & Time Index
- Time series object & plot

year <dbl>	month <dbl>	day <dbl>	date <S3: POSIXct>	active_power <dbl>	ambient_temperature <dbl>
2018	1	1	2018-01-01 00:00:00	-5.357727	23.14873
2018	1	1	2018-01-01 00:10:00	-5.822360	23.03975
2018	1	1	2018-01-01 00:20:00	-5.279409	22.94870
2018	1	1	2018-01-01 00:30:00	-4.648054	22.96685
2018	1	1	2018-01-01 00:40:00	-4.684632	22.93652
2018	1	1	2018-01-01 00:50:00	-4.756408	22.92078

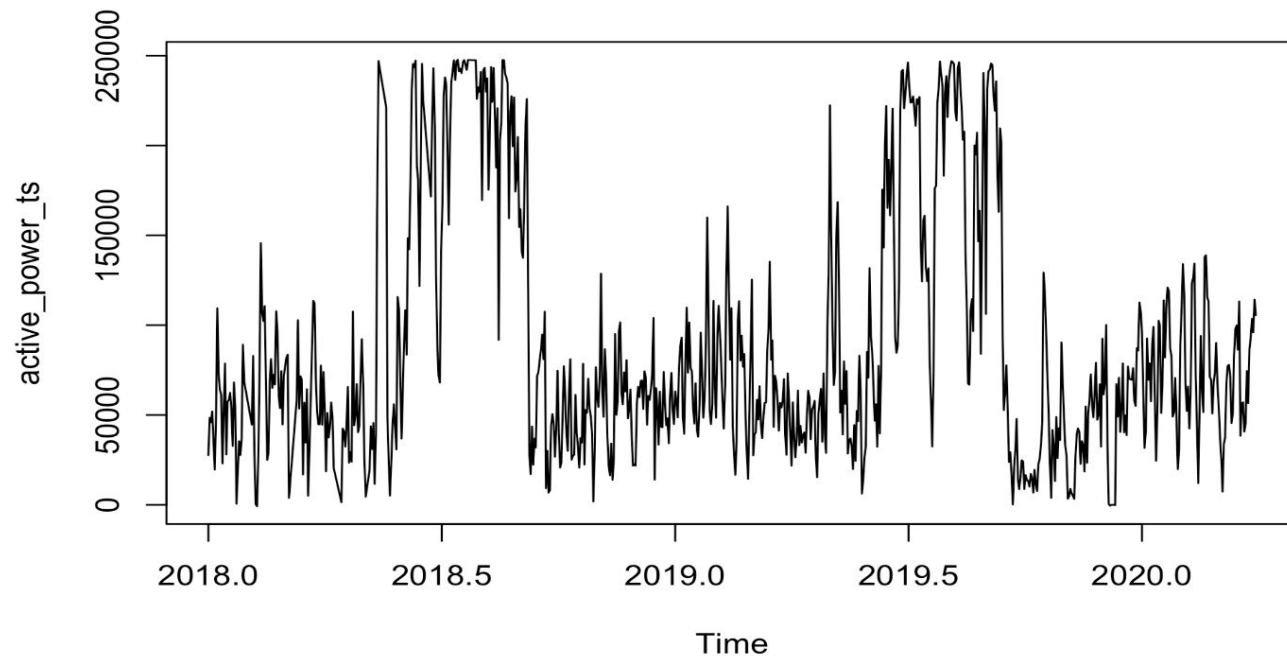


Aggregation & Time Index

- Time Index: daily
- Sum: active_power
- Mean: ambient_temperature,
wind_direction, wind_speed

year <dbl>	month <dbl>	day <dbl>	active_power <dbl>	ambient_temperature <dbl>	wind_direction <dbl>	wind_speed <dbl>
2018	1	1	27570.75	26.51846	281.5338	3.877159
2018	1	2	48501.81	25.64296	273.0350	4.666082
2018	1	3	45904.82	25.50581	275.8649	4.525500
2018	1	4	51965.39	24.94145	284.9853	5.064239
2018	1	5	34608.72	24.63629	280.6632	4.423846
2018	1	6	19547.61	22.57549	312.1341	3.813356

Time Series



active_power
<dbl>

27570.7490

48501.8066

45904.8192

51965.3897

34608.7212

19547.6142

51213.1585

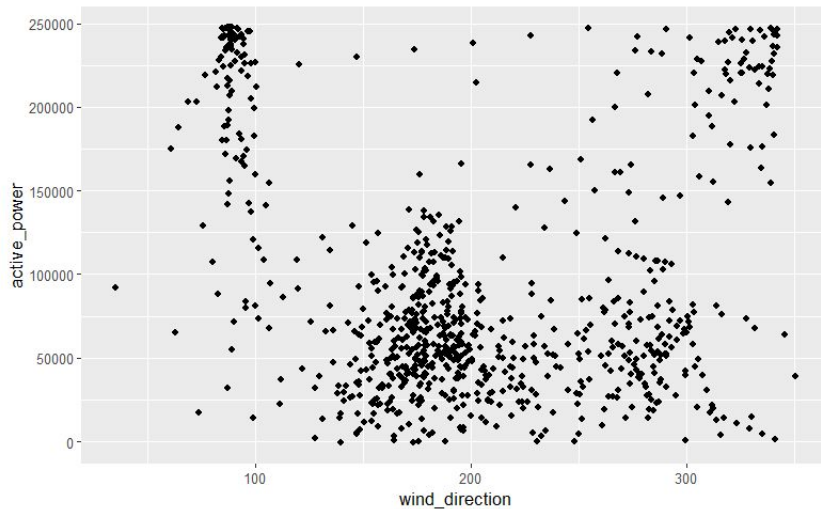
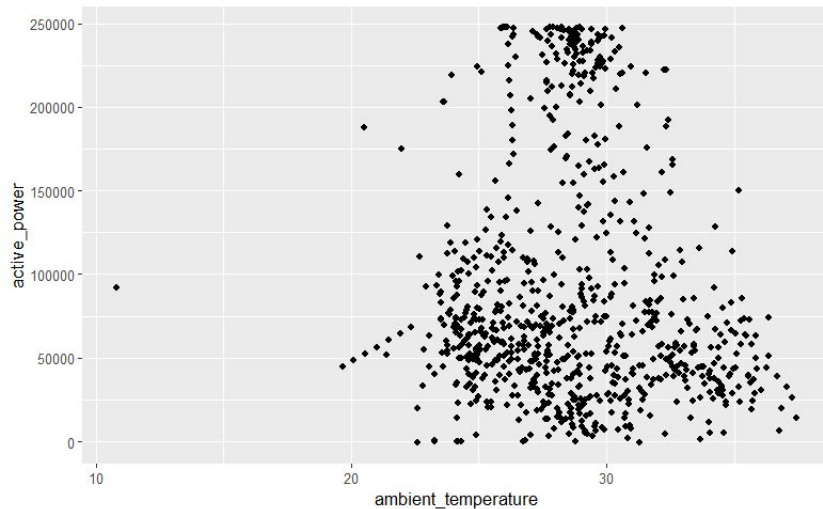
109448.1129

73036.1857

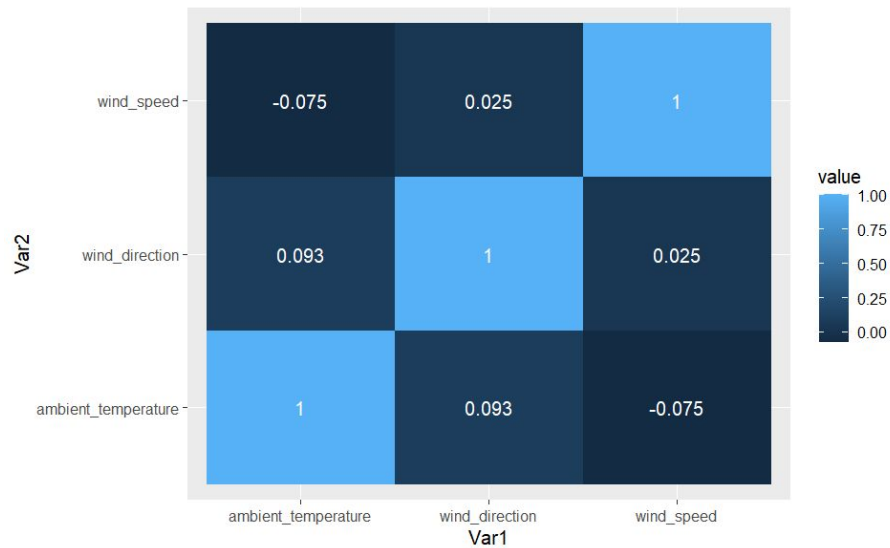
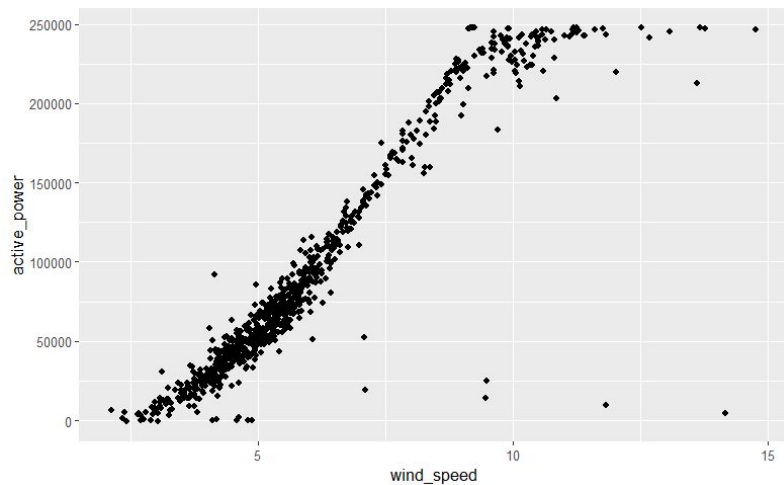
63902.4295



Exploratory Analysis



Exploratory Analysis





White noise

Box-Ljung test

```
data: active_power_ts  
X-squared = 3741.7, df = 8, p-value < 2.2e-16 ←
```

Stationarity

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)	
(Intercept)	57.76974	12.27628	4.706	2.97e-06	***
z.lag.1	-0.09046	0.01546	-5.849	7.14e-09	***
z.diff.lag	-0.08069	0.03490	-2.312	0.021	*

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 212.3 on 815 degrees of freedom
Multiple R-squared: 0.05547, Adjusted R-squared: 0.05315
F-statistic: 23.93 on 2 and 815 DF, p-value: 7.966e-11



Modeling Method

1. Explore Active Power Times Series Only

- Seasonal Exponential Smoothing
- Auto.arima without Intervention

2. Time Series Regression & Intervention

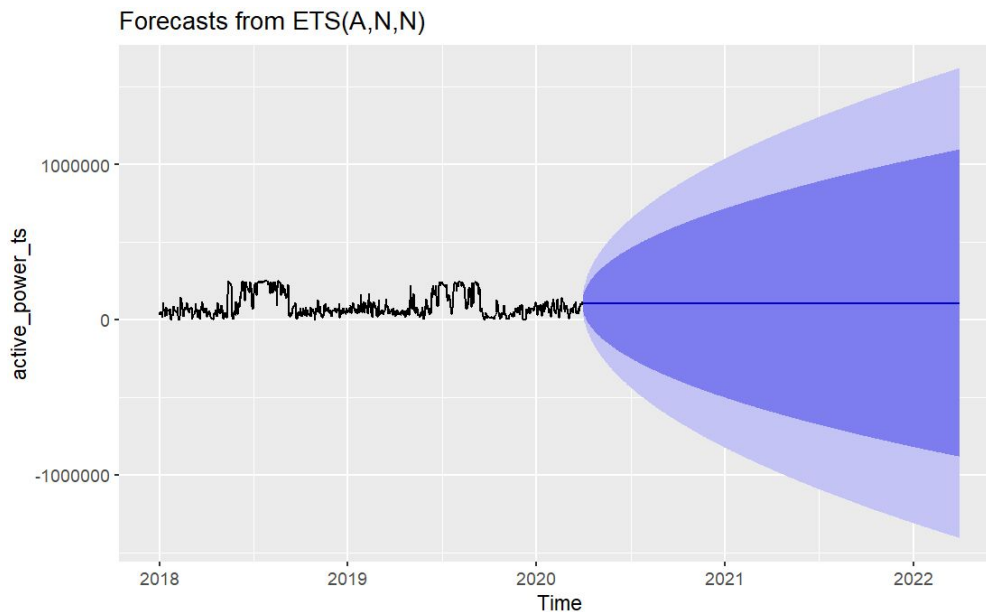
- Explore p, d, q
- auto. arima with Intervention

Seasonal Exponential Smoothing Model

Training set error measures:

	ME	RMSE	MAE	MPE	MAPE	MASE	ACF1
Training set	74.1439	32242.08	23349.82	-Inf	Inf	0.5370699	0.01592923

RMSE: 32242



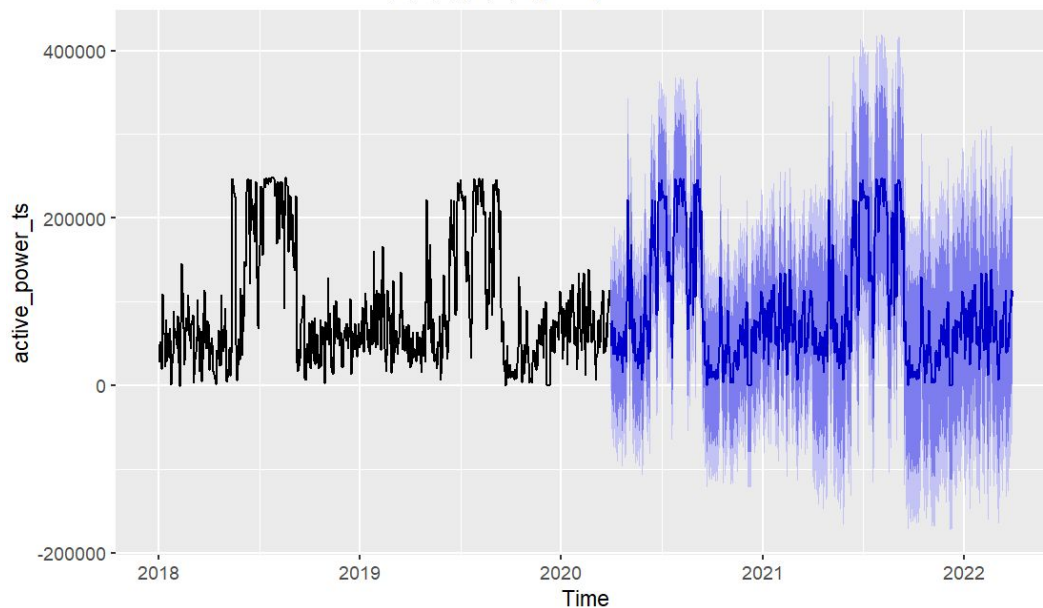
Auto.arima without Intervention

Training set error measures:

	ME	RMSE	MAE	MPE	MAPE	MASE	ACF1
Training set	-487.6294	30628.84	17636.59	NaN	Inf	0.4056599	0.02762721

RMSE: 30628

Forecasts from ARIMA(1,0,0)(0,1,0)[365]



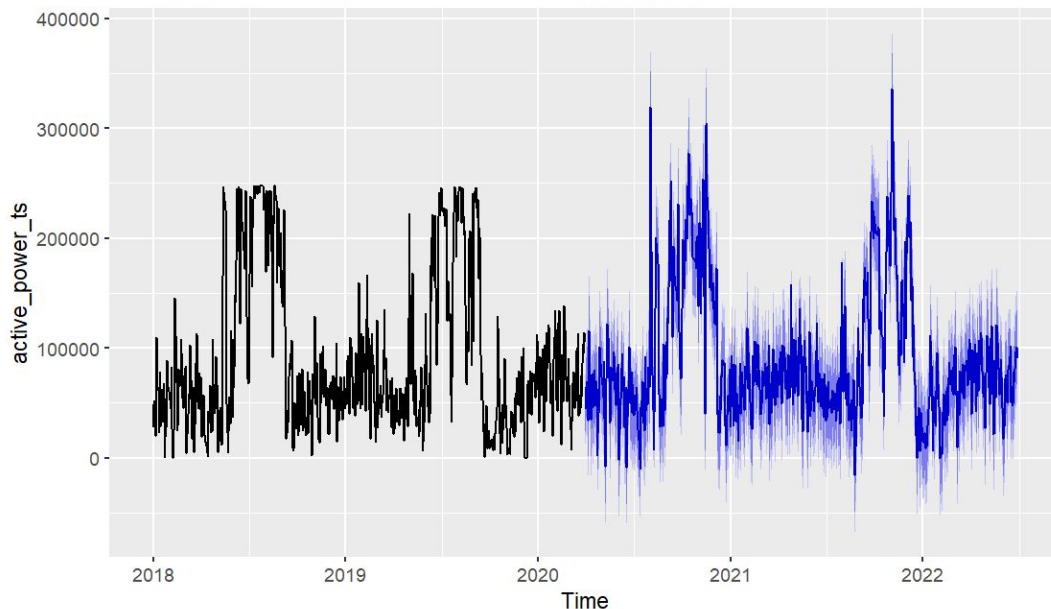
Time Series Regression - Explore p, d, q (Final Model)

Training set error measures:

	ME	RMSE	MAE	MPE	MAPE	MASE	ACF1
Training set	3.031391	15870.51	10250.08	-Inf	Inf	0.2357625	0.002777523

RMSE: 15870

Forecasts from Regression with ARIMA(5,0,0) errors

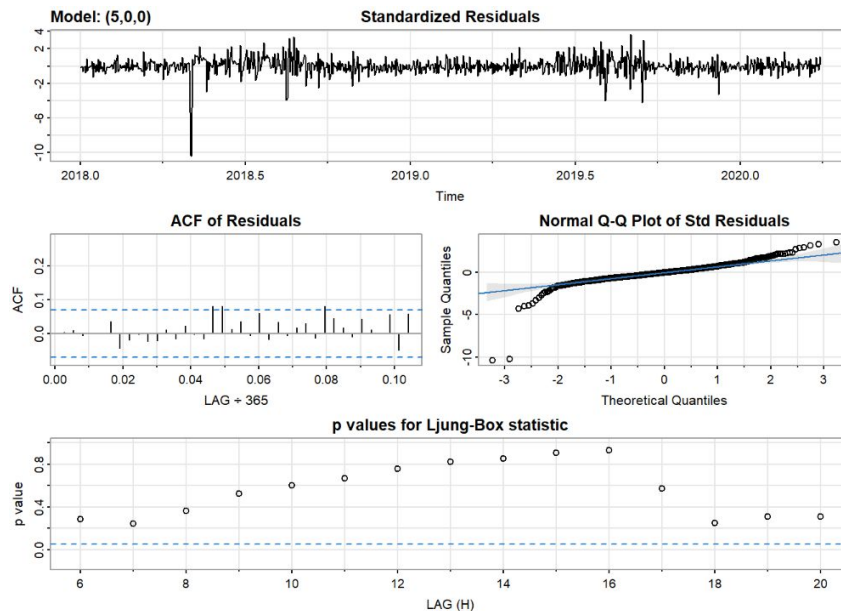


Time Series Regression - ARIMA(5,0,0)

	Point Forecast <dbl>	Lo 80 <dbl>	Hi 80 <dbl>	Lo 95 <dbl>	Hi 95 <dbl>
2020.2466	44205.7417	23779.48782	64632.00	12966.4822	75445.00
2020.2493	64354.8817	36788.49637	91921.27	22195.7335	106514.03
2020.2521	56360.7719	25823.38168	86898.16	9657.8638	103063.68
2020.2548	69303.4110	37158.79067	101448.03	20142.4565	118464.37
2020.2575	51329.3116	18859.74017	83798.88	1671.3873	100987.24

\$ttable

	Estimate	SE	t.value	p.value
ar1	0.9063	0.0344	26.3073	0.0000
ar2	-0.1781	0.0467	-3.8155	0.0001
ar3	0.0698	0.0468	1.4931	0.1358
ar4	-0.1697	0.0465	-3.6481	0.0003
ar5	0.1571	0.0345	4.5508	0.0000
intercept	-75070.6765	4320.0039	-17.3775	0.0000
wind_speed	27806.9496	582.3119	47.7527	0.0000



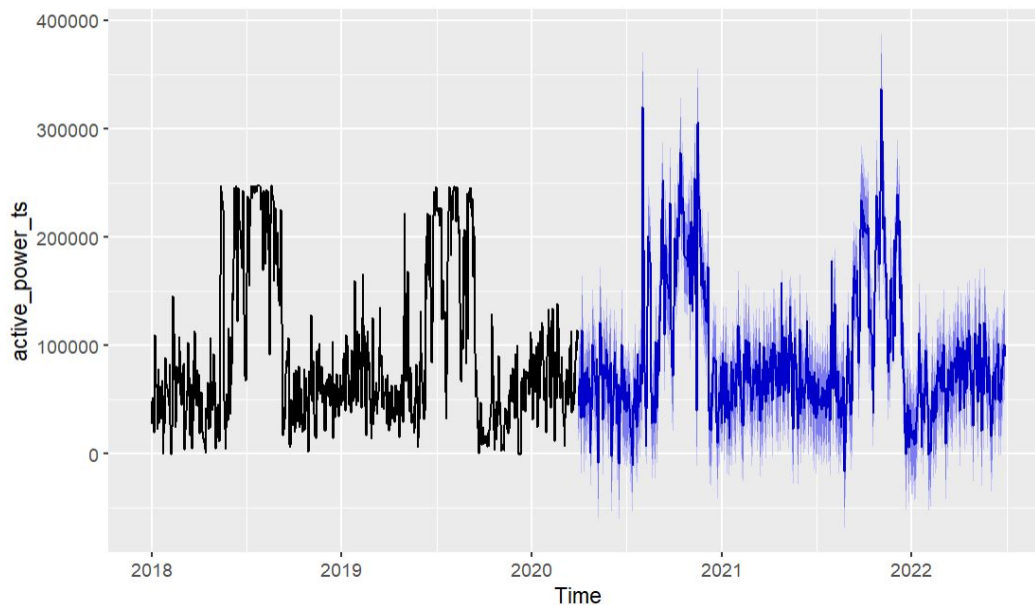
Auto.arima with Intervention

Training set error measures:

	ME	RMSE	MAE	MPE	MAPE	MASE	ACF1
Training set	7.072441	16073.93	10296.59	-Inf	Inf	0.2368323	-0.0006827484

RMSE: 16074

Forecasts from Regression with ARIMA(1,0,1) errors



Conclusions

In the future	Amount of Power
2020/3/31	44206
2020/4/1	64355
2020/4/2	56360
2020/4/3	69303
2020/4/4	51329

