

Figure A.1: Data-driven modeling of non-homogeneous Poisson process; MBIC penalty. DB-SCAN outliers are drawn in black.

# Supplementary material

### Appendix A. PELT with MBIC and AIC penalty

This appendix offers a sensitivity analysis of the PELT algorithm with respect to the result of Algorithm 1. Figure A.1 shows the change-point identified by PELT and the resulting clustering via DBSCAN when PELT uses the default Modified Bayesian Information Criterion (MBIC) penalty. In this case, the change-points returned by PELT are so well-concentrated that the clustering step is barely needed. Accordingly, the number of outliers returned by DBSCAN (shown in black) is extremely limited. Identified clusters are limited in number and typically located early in the morning or late in the evening. Thus, the Poisson intensities returned by Algorithm 1 have a very straightforward interpretation as day and night regimes.

Figure A.2 shows the change-point identified by PELT and the resulting clustering via DBSCAN when PELT uses the Akaike Information Criterion (AIC) penalty. In this setting, PELT is much more sensible and detects regime changes in correspondence of maxima and minima of the average demand. The resulting description of the arrival stream in terms of a Poisson process is hence richer

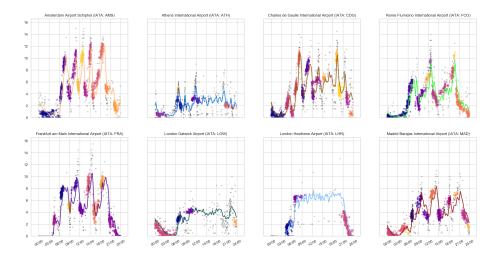


Figure A.2: Data-driven modeling of non-homogeneous Poisson process; AIC penalty. DBSCAN outliers are drawn in black.

and follows more closely the average demand. However, the increased sensibility in the change point detection comes at the price of a *noisy* distribution of change-points in the  $(t, \lambda)$  plane, which might be difficult to reconstruct via DBSCAN (see LGW).

#### Appendix B. Continuous wavelet transform of demand time series

Figure B.3 shows a continuous wavelet transform of the demand from the week August 01–07, 2016. On the x-axis there is time and on the y-axis the scale parameter of the Ricker wavelet, the color bar shows the value of the coefficients of the transform. The plot highlights the presence of a low-frequency component with daily periodicity and high-frequency demand peaks with sufficient regularity, the strength and frequency of which varies across airports.

#### Appendix C. Correlations from regulated flight plan and PSRA model

Figure C.4 shows the Pearson's correlation  $\rho_{t_i,t_{i+1}}$  between the simulated demand variation in the intervals  $[t_i,t_{i+1})$  and  $[t_{i+1},t_{i+2})$ . The simulated demand variation is obtained by subtracting the demand according to the regulated flight plan  $t^r$  from the demand simulated from Model (3).

Comparing Figures 6 and C.4, we observe that the Pre-Scheduled Random Arrivals (PSRA) model (3) captures very well this characteristic of the inbound flow.

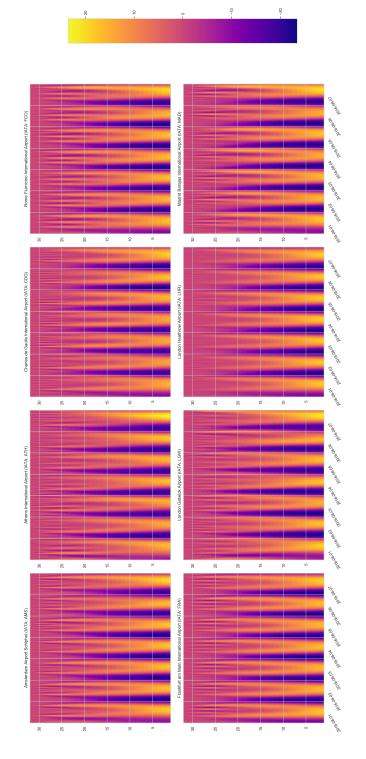
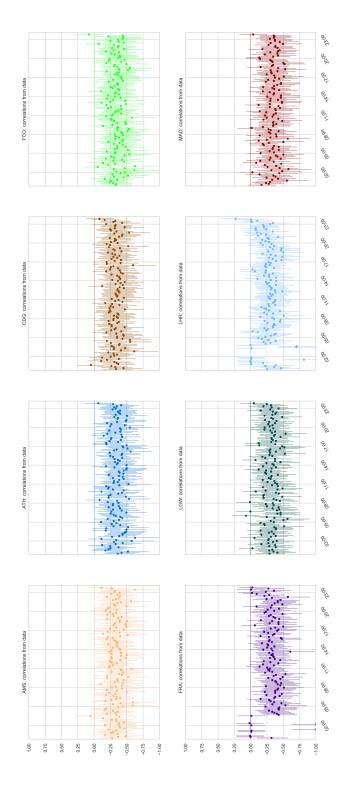


Figure B.3: Continuous wavelet transform of the demand for the week August 01–07, 2016. The figure clearly shows the presence of a weekly periodic component in the demand at all airport under consideration.



confidence interval for Pearson's  $\rho$ . Figure C.4: Correlations from simulation of Model (3). Error bars show 95%

## Appendix D. Intensity function of the data-driven Poisson process

This appendix details the intensity function of the Poisson process obtained in Section 3.3.1. The intensity function is a periodic right-continuous step-function, which takes on value  $\hat{\lambda}$  between two consecutive values of  $\hat{t}$ . The values of  $\hat{t}$  and  $\hat{\lambda}$  are reported for each airport by Table D.1 below. The table shows how the model correctly captures the typical hourly landing rate in the moments of highest demand, when we expect the airport to operate close to its maximum capacity. For LHR,  $\lambda=0.64$  aircraft/min corresponds to 38.4 aircraft/hour, which is close to the maximum declared capacity of 45; for FRA,  $\lambda=0.90$  aircraft/min corresponds to 54 aircraft/hour, which is close to the maximum declared capacity of 60; finally, for AMS,  $\lambda=1.13$  aircraft/min corresponds to 67.8 aircraft/hour, which is very close to the the maximum declared capacity of 68 (capacity data from https://ext.eurocontrol.int/airport\_corner\_public/).

Table D.1: Non-homogeneous Poisson process derived by PELT and DBSCAN algorithms. The table reports the centroids of the clusters identified by DBSCAN and shown in Figure 7. Times are local.

| airport     | time                        | λ                                 |
|-------------|-----------------------------|-----------------------------------|
| FRA         | $04:32\ {\rm UTC}{+}02$     | $0.2657~\mathrm{aircraft/min}$    |
|             | $06:41\ UTC+02$             | $0.7325~\mathrm{aircraft/min}$    |
|             | $08:55\ {\rm UTC}{+}02$     | $0.4991~\mathrm{aircraft/min}$    |
|             | $10:33~{\rm UTC}{+}02$      | $0.8550~\mathrm{aircraft/min}$    |
|             | $12:14\ UTC+02$             | $0.4530~\mathrm{aircraft/min}$    |
|             | $14:31\ UTC+02$             | $0.8757 \; \mathrm{aircraft/min}$ |
|             | $16:31\ UTC+02$             | $0.4270~\mathrm{aircraft/min}$    |
|             | $18:29\ UTC+02$             | $0.9034~\mathrm{aircraft/min}$    |
|             | $22:04\ UTC+02$             | $0.1182~\mathrm{aircraft/min}$    |
| $_{ m LGW}$ | $02:40\ \mathrm{UTC}{+}01$  | $0.0671~\mathrm{aircraft/min}$    |
|             | $06:54\ \mathrm{UTC}{+}01$  | $0.2858~\mathrm{aircraft/min}$    |
|             | $10:10\ {\rm UTC}{+}01$     | $0.4195~\mathrm{aircraft/min}$    |
|             | $23:26\ UTC+01$             | $0.2328~\mathrm{aircraft/min}$    |
| LHR         | $00.25 \ \mathrm{UTC}{+}01$ | $0.0000~\mathrm{aircraft/min}$    |
|             | $04:56\ UTC+01$             | $0.1409 \; \mathrm{aircraft/min}$ |
|             | $07:16\ UTC+01$             | $0.6410~\mathrm{aircraft/min}$    |
|             | $22:24\ UTC+01$             | $0.1424 \; \mathrm{aircraft/min}$ |
| AMS         | $02:47\ \mathrm{UTC}{+}02$  | $0.0537~\mathrm{aircraft/min}$    |
|             | $06:30\ UTC+02$             | $0.4222~\mathrm{aircraft/min}$    |
|             | $07:25\ {\rm UTC}{+}02$     | $0.9062~\mathrm{aircraft/min}$    |
|             | $08:53\ {\rm UTC}{+}02$     | $0.4416~\mathrm{aircraft/min}$    |
|             | 10:28 UTC+02                | $0.9006 \; \mathrm{aircraft/min}$ |

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Table D.1 –  $continued\ from\ previous\ page$ 

| airport                | time                          | $\frac{\lambda}{\lambda}$         |  |
|------------------------|-------------------------------|-----------------------------------|--|
|                        | 11:30 UTC+02                  | 0.5334 aircraft/min               |  |
|                        | $12:38\ UTC+02$               | $1.0207~\mathrm{aircraft/min}$    |  |
|                        | $13:35\ UTC+02$               | $0.4785~\mathrm{aircraft/min}$    |  |
|                        | $15{:}00~{\rm UTC}{+}02$      | $1.0653~\mathrm{aircraft/min}$    |  |
|                        | $16{:}23~{\rm UTC}{+}02$      | $0.5189~\mathrm{aircraft/min}$    |  |
|                        | $18{:}26\ {\rm UTC}{+}02$     | $1.1255~\mathrm{aircraft/min}$    |  |
|                        | $19.52~{\rm UTC}{+}02$        | $0.4881~\mathrm{aircraft/min}$    |  |
|                        | $22{:}26~{\rm UTC}{+}02$      | $0.1942~\mathrm{aircraft/min}$    |  |
| MAD                    | $01:00\ {\rm UTC}{+}02$       | $0.0386~\mathrm{aircraft/min}$    |  |
|                        | $04:30\ {\rm UTC}{+}02$       | $0.1240~\mathrm{aircraft/min}$    |  |
|                        | $06:12\ UTC+02$               | $0.0293~\mathrm{aircraft/min}$    |  |
|                        | $07{:}14~{\rm UTC}{+}02$      | $0.3511~\mathrm{aircraft/min}$    |  |
|                        | $09:19\ UTC+02$               | $0.5870~\mathrm{aircraft/min}$    |  |
|                        | $11:18\ UTC+02$               | $0.3470~\mathrm{aircraft/min}$    |  |
|                        | $13:02\ UTC+02$               | $0.7084~\mathrm{aircraft/min}$    |  |
|                        | $15:14\ UTC+02$               | $0.3574~\mathrm{aircraft/min}$    |  |
|                        | $17:56\ UTC+02$               | $0.5905~\mathrm{aircraft/min}$    |  |
|                        | $20\text{:}01~{\rm UTC}{+}02$ | $0.6972~\mathrm{aircraft/min}$    |  |
|                        | $22:33 \ \mathrm{UTC} {+} 02$ | $0.3309 \; \mathrm{aircraft/min}$ |  |
|                        | $23{:}35~{\rm UTC}{+}02$      | $0.1493 \; \mathrm{aircraft/min}$ |  |
| CGD                    | $01:24\ UTC+02$               | $0.0530~\mathrm{aircraft/min}$    |  |
|                        | $05:18\ UTC+02$               | $0.1852 \; \mathrm{aircraft/min}$ |  |
|                        | $07:08\ UTC+02$               | $0.5127~\mathrm{aircraft/min}$    |  |
|                        | $08:06\ UTC+02$               | $1.0003 \; \mathrm{aircraft/min}$ |  |
|                        | 09:11 UTC+02                  | 0.4170 aircraft/min               |  |
|                        | $10:32\ UTC+02$               | $0.8515 \; \mathrm{aircraft/min}$ |  |
|                        | 12:11 UTC+02                  | 0.3950 aircraft/min               |  |
|                        | 13:06 UTC+02                  | 0.6116 aircraft/min               |  |
|                        | 15:29 UTC+02                  | 0.6669 aircraft/min               |  |
|                        | 19:09 UTC+02                  | 1.0227 aircraft/min               |  |
|                        | 20:01 UTC+02                  | 0.4632 aircraft/min               |  |
|                        | 22:16 UTC+02                  | 0.3120 aircraft/min               |  |
|                        | 23:21 UTC+02                  | 0.0631 aircraft/min               |  |
| ATH                    | 01:27 UTC+03                  | 0.0445 aircraft/min               |  |
|                        | 06:45 UTC+03                  | 0.4592 aircraft/min               |  |
|                        | 07:16 UTC+03                  | 0.2315 aircraft/min               |  |
|                        | 12:03 UTC+03                  | 0.3028 aircraft/min               |  |
| EGG                    | 21:27 UTC+03                  | 0.1993 aircraft/min               |  |
| FCO                    | 03:29 UTC+02<br>06:47 UTC+02  | 0.1019 aircraft/min               |  |
|                        | 06:47 UTC+02<br>09:24 UTC+02  | 0.5395 aircraft/min               |  |
|                        |                               | $0.3155~\mathrm{aircraft/min}$    |  |
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Table D.1 - continued from previous page

|         | J                        | 1 1 3                          |
|---------|--------------------------|--------------------------------|
| airport | $_{ m time}$             | λ                              |
|         | $11:49\ UTC+02$          | $0.6698~\mathrm{aircraft/min}$ |
|         | $12:30\ {\rm UTC}{+}02$  | $0.8899~\mathrm{aircraft/min}$ |
|         | $14:48\ UTC+02$          | $0.3965~\mathrm{aircraft/min}$ |
|         | $18:58\ UTC+02$          | $0.7465~\mathrm{aircraft/min}$ |
|         | $19:31\ UTC+02$          | $1.0422~\mathrm{aircraft/min}$ |
|         | $21{:}37~{\rm UTC}{+}02$ | $0.2130~\mathrm{aircraft/min}$ |
|         |                          |                                |