

CASE STUDY ON EFFECTS OF THE MANDATORY VALIDATION ON BUS COMMERCIAL SPEED

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1 **CASE STUDY ON EFFECTS OF THE MANDATORY VALIDATION ON BUS**  
2 **COMMERCIAL SPEED**

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**1 ABSTRACT**

2 The paper aims to define the new operational requirements and procedures to allow the GTT  
3 (Torino public transport company) to implement mandatory validation without negative impacts  
4 on both the company and the users. To this end, a four-step methodology has been put forward:  
5 a) choice of the reference route and trip sampling; b) data acquisition; c) boarding time analysis  
6 and d) future scenario definition.

7 Attained results show that the most unfavourable situation for the company is banning people  
8 from boarding the bus/tram through any door (the case today) because it requires, in order to  
9 maintain the same time interval at bus stops, an increase of trips in the morning peak hour. Thus,  
10 the present system limits the outcomes negatively for the users in terms of waiting time.

11 However, a change could lead to such positive consequences as fuller passenger cooperation to  
12 validate tickets/passes and a more ordered boarding, thus reducing fraud and improving the  
13 image of the company.

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18 *Keywords:* Public Transport, Boarding Time, Commercial Speed, Smart Card, Validation.

19

## 1 INTRODUCTION

2 The mandatory validation of transport tickets and passes when boarding public transport is useful  
3 to ensure a correct collection of fares, to limit free-ridership and to consolidate company  
4 revenues. Besides, it is a convenient practice for collecting huge amount of travel data, allowing  
5 a better operation, management, processing of information and control of the public service (1-  
6 4). However, it may demand extra time for the users as well as some operational adjustments for  
7 the public transport (PT) operators.

8 Dwell time is defined by York (5) as the time when the wheels are stationary at a bus stop  
9 while other researchers consider it as the time from the bus doors' opening to their complete  
10 closing (6-8). This latter definition may include the time when the doors are already, or still,  
11 "open" even though passengers are not getting on or off.

12 Dwell time depends on several factors according to the specific characteristics of the:

- 13 • vehicle (number and width of the doors, steps at the doors, deck height, number of decks,  
14 length and typology of the vehicle) (6,9-11);
- 15 • infrastructure (location and length of the platforms, dedicated lanes) (9,12,13);
- 16 • payment system (on board or not) and ticket type (paper, magnetic, smart card) (9,14).

17 However, despite the above factors, the key elements influencing dwell time are the  
18 transport demand and its characteristics (15): the number of passengers moving from one mode  
19 to another at the stop and their age (9); particular conditions such as the presence of wheelchairs  
20 and strollers; time of day and weather conditions (15).

21 The dwell time may be very significant as regards to the total travel time. By analysing  
22 the data referring to several US cities from 1957 to 1980, Levinson (16) estimated that dwell  
23 time in urban areas accounts for 9 to 26% of overall travel time, depending on incoming  
24 passengers. More recently, Tirachini (14), analysing public transport in Sydney, Australia, found  
25 lower values, from 3 to 13%, according to the transport demand. Such figures show how  
26 intervening on the factors affecting dwell time is crucial to increasing commercial speed and,  
27 consequently, to increasing the efficiency of operations of the Public Transport company. This  
28 would also guarantee positive impacts for the users (9), since a more precise detection of  
29 passenger flow would help to organise the service, and better tailor transport offers to user needs.  
30 Furthermore, validation would help detect fraud.

31 Multiple regression models are the typical approach used to estimate the influence of the  
32 different factors on dwell time (9); those models are based on data related to the number of  
33 passengers getting on (boarding) and off (alighting) at each stop, as suggested by the Transit  
34 Capacity and Quality of Service manual (15). Instead, Levinson (16) defined a linear relation: the  
35 dwell time is 5 seconds plus 2.75 seconds per passenger getting on and off (s/pax), while  
36 Fernández et al. (17) estimated a range of 2.05 to 6.04 s for each passenger.

37 The TCSQ Manual (15) suggests using a multivariate linear regression differentiating  
38 incoming and outgoing flows and proved that boarding time for incoming passengers is greater  
39 than alighting time for outgoing passengers. Moreover, the change of vehicle/mode (in both  
40 directions) is faster during peak hours because of the different users' typology at different times  
41 of day. Similar to Levinson (16), the TCSQ Manual (15) proposes adding a constant time for  
42 each passenger boarding on or alighting from the bus.

43 Tirachini (9) suggests considering the difference between a simultaneous passengers'  
44 flow (use of different doors for boarding and alighting) or a sequential one (the same door used  
45 both for getting on and off).

46 Several studies analysed the influence of vehicle occupancy, particularly focusing on the  
47 effects of crowding and friction between passengers while boarding and alighting (6-8). Zhang

1 and Teng (18) proved that considering the crowding on the bus allows for a better estimation of  
2 the dwell time than using only the number of people boarding and alighting.

3 Sun et al. (13) showed that high occupancy slows down boarding (+0.340 s/pax) while  
4 slightly speeding up alighting (-0.083 s/pax). When the occupancy is about 60% of vehicle  
5 capacity, internal frictions produce delays in the boarding time since the incoming flow can get  
6 on only when the vehicle occupancy falls below a minimum level (13). Tirachini (9) focused  
7 mainly on the effects of frictions when boarding occurs in parallel queues. The relevance of this  
8 effect is surprisingly high, since boarding time requires extra time equal to 1.25 s/pax; these  
9 delays are more significant when the transport demand is higher.

10 To reduce bus travel time, Levinson (16) considered decreasing the number of stops and  
11 the length of dwell times to be more effective, thanks to changes in fare collection policies and  
12 door configuration, than providing bus priority lanes or reducing traffic-related congestion.

13 Notwithstanding several existing studies, an additional effort is needed to understand  
14 which is the best configuration, taking into account the different contexts and typologies of  
15 passengers.

16 This paper aims to test the effect on boarding time – on public transport lines in Torino –  
17 of different hypotheses related to different doors' operation by evaluating three different  
18 scenarios. The motivation of the research arises because the Gruppo Torinese Trasporti (GTT),  
19 the PT company operating in Torino, was wondering whether changing or not the current way  
20 passengers board buses and trams. Indeed, a recent Italian law of the Regione Piemonte (L.R. n.  
21 1, 27.01.2015, art. 21, comma 29, came into force in May 2017) has required mandatory  
22 validation by all PT passengers, including pass holders – the previous practice being that only  
23 single ticket holders had to validate.

24 The purpose of the above regional initiative would allow for the collection of massive  
25 travel data (1-4) and, thus, support the transport authority (Agenzia della Mobilità Piemontese)  
26 to: evaluate if the current network well suit the current demand; monitor the quality of the  
27 service; better plan and program the transport services and, eventually, trigger a social control  
28 onboard thus making the system less susceptible to free-ridership.

29 Despite the fact that the new practice would generate multiple benefits, the GTT has had  
30 to face several operational issues:

- 31 • the increase of boarding time and consequently of travel time, entailing a lower  
32 commercial speed;
- 33 • the change in scheduling and, therefore, in the overall costs;
- 34 • the appropriate relocation of ticket machines and the introduction of new ones to speed  
35 up boarding time.

36 The scenario analysed by Tirachini (14) in Sydney – simultaneous flows, each through  
37 one door – is dissimilar to the Torino sequential flows through four doors. Indeed, the rule  
38 provides an alternating flow, alighting first and then boarding, but the practice of simultaneous  
39 flows through a double-stream door is common. The current study, unlike the Sydney study, does  
40 not differentiate the relevance of the characteristics of the vehicle, since all data are referred to  
41 the same bus typology (3-axle, 18 m long articulated urban buses).

42 The next section focuses on the methodology, describing the survey and the data analysis  
43 design. Following this, results are discussed and conclusions and suggestions to transport  
44 company are put forward.

## 45 **METHODOLOGY**

46 GTT decided to test the introduction of the mandatory validation before putting it into place,  
47

1 asking for the help of the authors to design the pilot program on the GTT lines. The test has  
2 followed a four-step methodology: 1) selection of a test line, choosing the reference route and  
3 trip sampling; 2) data collection; 3) data analysis design and model specification; and 4) scenario  
4 definition and analysis.

5 The urban and suburban network operated by GTT includes approximately 100 lines with  
6 different functions (ordinary, special, school, etc.) and, therefore, different passenger typologies.  
7 As the introduction of mandatory validation is supposed to increase boarding time, line 18 was  
8 selected for the test, being one of the ten surface lines carrying 50% of total passengers, the third  
9 most-used line of the entire surface network, and the first most-used bus line. Line 18 runs along  
10 the North-South axis from Piazza Sofia (S Terminus) to Piazza Caio Mario (C Terminus) along  
11 28.168 km (17.5 mi), round-trip, on non-dedicated lanes, serving 88 stops (44 per direction,  
12 terminus excluded).

13 The buses used along line 18 are IRISBUS CITELIS produced by Iveco, 18 meters long  
14 and supported by 3 axles. They are equipped with four two-way working doors: boarding and  
15 alighting is authorised through all doors, with priority for passengers getting off. The vehicle  
16 capacity is equal to 159 passengers, including one disabled person.

17 Sample trips to collect data on dwell time were selected according to the following  
18 criteria:

- 19 • weekday peak-hour trips: morning (7:00 – 9:00) and evening (16:00 – 20:00); peak-hour  
20 trips represent time of the day with the greatest ridership;
- 21 • weekday off-peak trips (9:00 – 16:00) in order to highlight, albeit partially, differences in  
22 scopes, habits, and user typologies that could influence boarding times;
- 23 • weekend trips: periods of greatest ridership (16:00 – 21:00 on Saturdays, 10:00 – 12:00  
24 and 17:00 – 20:00 on Sundays) to have a picture of weekend trips;
- 25 • weather: all selected trips were run during non-rainy days, to limit bias resulting from  
26 differences in atmospheric conditions;
- 27 • holidays were excluded as they represent unusual periods for transport demand.

28 The sample does not consider all the above listed criteria due to operational and  
29 economic reasons, as explained in section 2.1 ahead. All trips were sampled from a period  
30 running from September to December 2016.

### 31 **Data collection**

32 A wide range of methods was considered for the data collection on passenger boarding and  
33 alighting, from automatic passenger counting devices to manual on-board monitoring.  
34 Eventually, data recording by closed-circuit television (CCTV, video surveillance cameras) was  
35 used because this method allows for the collection of all necessary data about the passenger and  
36 does not require additional hardware or staff costs. Moreover, the use of CCTV images is  
37 allowed by Italian Article 100.1, D.L. 30 June 2003, n° 196, for educational and research  
38 purposes.  
39

40 The vehicles used along the selected trips were identified, and when they returned to  
41 depot, the hard-drives were collected, the raw files were transferred to local machines and an  
42 operator analysed the videos and logged the following variables into a data sheet:

- 43 • trip direction, bus number and trip number, in order to associate the video with a single  
44 trip;
- 45 • opening time of the first door; usually all doors open at once, but in some cases some  
46 doors remained closed;

- 1 • closing time of the last door; usually doors do not close all at once but depend on the  
2 driver and passenger flow through each door;
- 3 • number of people boarding and alighting; flows through each door are bidirectional,  
4 people can get on or off. For each door the number of outgoing and incoming travellers was  
5 recorded;
- 6 • particular events. As some stops are located close to traffic lights, drivers often hold the  
7 doors open until the end of the green cycle. To exclude the traffic light influence, the time of the  
8 last passenger boarding was recorded and a 3-second interval added to simulate the closing time  
9 of the doors as in free-flow traffic conditions. Moreover, any special event that could cause an  
10 abnormal timeframe between the opening and the closing of the doors was recorded (e.g.  
11 boarding of disabled people, families with strollers, or change of driver);
- 12 • stop duration at both termini (departure and arrival); the number of passengers on board  
13 and closing time of the doors were recorded at the departure terminus as well as opening time of  
14 doors and number of people alighting at the arrival terminus.

15 The above data were used to calculate the following variables for each stop:

- 16 • timeframe of opening/closing of doors:  $T_{o/c}$  = timeframe between the opening of the first  
17 door and the complete closing of the last one, including the mechanical time to close the door;
- 18 • number of people boarding:  $N_b$  = total number of people getting on at the given stop;
- 19 • number of people alighting:  $N_a$  = total number of people getting off at the given stop;
- 20 • load factor:  $\%_{occ}$  = ratio of the number of people on board to vehicle capacity (equal to  
21 159 passengers);
- 22 • total trip time;  $T_{tt}$  = timeframe between the closing of the last door at the departure  
23 terminus and the opening of the first door at the arrival terminus;
- 24 • door usage percentage;  $D_{ib}$ ,  $D_{ia}$  = ratio of total number of passengers at each stop  
25 boarding (b) and alighting (a) at the door (i), to total number of passengers at each stop boarding  
26 and alighting at all doors. Even though the data collection through the on-board video-  
27 surveillance cameras allowed the manual acquisition of appropriate information, there are some  
28 external and internal methodological limitations:
  - 29 – difficulties in obtaining desired specific CCTV registration disks due to a lack of full  
30 availability: damaged or malfunctioning hard-drives;
  - 31 – poor visibility: the CCTV's camera position and framing were designed for security  
32 purposes, making them suboptimal for visualising and counting passengers.

33 Finally, occupancy, flow speed, parallel boarding, light refraction and low video quality  
34 made manual counting time-consuming, forcing the operator logging the information to watch  
35 the videos again to observe all the details useful to collect the needed data.

### 37 **Data analysis design and model specification**

38 The model specification, based on the relevant literature (8, 13, 18) is described in equation (1).  
39 Boarding and alighting have to be separately considered, since their associated times can be very  
40 different (15) as the mandatory smart-card validation concerns boarding passengers only.

41 The relation between the dependent variable  $T_{o/c}$  and the independent variables – number  
42 of people alighting, the number of people boarding and ridership percentage – has been studied  
43 thanks to a backward stepwise multiple regression analysis, where successive iterative estimates  
44 were computed after deletion of insignificant ( $p > 0.05$ ) regression coefficients,  $\beta_i$ . The model was  
45 defined as follows:

$$46 \quad 47 \quad T_{o/c} = c + \beta_1 N_a + \beta_2 N_b + \beta_3 \%_{occ} + \beta_4 N_a^2 + \beta_5 N_b^2 + \beta_6 \%_{occ}^2 + \beta_7 N_a N_b + \beta_8 \times N_b \%_{occ} + \beta_9 N_a \%_{occ} + \varepsilon \quad (1)$$

1 where:  
 2  $c$  = intercept;  
 3  $N_a$  = number of people alighting through the most used door at the given stop;  
 4  $N_b$  = number of people boarding through the most used door at the given stop;  
 5  $\%_{occ}$  = ridership percentage;  
 6  $\beta_i$  = regression coefficients associated with the independent variables, their quadratic  
 7 measures and their respective pairwise interactions;  
 8  $\varepsilon$  = normally distributed error term.

9 The most used doors were identified by adding boarding and alighting passengers; thus,  
 10 the maximum number of persons getting off and on through these doors is defined as  $N_{maxa}$  and  
 11  $N_{maxb}$ . Two different estimates of parameters were produced for weekdays and for weekends  
 12 because the influence of the independent variables on  $T_{o/c}$  is moderated by factors depending on  
 13 the day of the week, notably trip scope, user habits and user typologies (15).  
 14

### 15 Definition and analysis of future scenarios

16 For each of the selected bus trips, three scenarios were defined along with the Current Situation  
 17 (two-way working doors and non-mandatory smart-card validation, values from previously  
 18 manually recorded data) and are summarised in Table 1.  
 19

20 **TABLE 1 Scenario definition**  
 21

|                      | <b>Mandatory smart-card validation</b> | <b>Door 1</b>          | <b>Door 2</b>          | <b>Door 3</b>          | <b>Door 4</b>          |
|----------------------|--|------------------------|------------------------|------------------------|------------------------|
| <b>S<sub>0</sub></b> | NO                                     | Boarding and alighting | Boarding and alighting | Boarding and alighting | Boarding and alighting |
| <b>S<sub>1</sub></b> | YES                                    | Boarding and alighting | Boarding and alighting | Boarding and alighting | Boarding and alighting |
| <b>S<sub>2</sub></b> | YES                                    | Boarding only          | Alighting only         | Alighting only         | Alighting only         |
| <b>S<sub>3</sub></b> | YES                                    | Boarding only          | Alighting only         | Alighting only         | Boarding only          |

22  
 23 Concerning scenarios  $S_2$  and  $S_3$ , the number of boarding and alighting passengers through  
 24 each door were assigned as follows:

- 25 • Scenario  $S_2$ : all boarding passengers were associated with the front door (door 1) whereas  
 26 those alighting from door 1 were equally redistributed through doors 2 to 4;
- 27 • Scenario  $S_3$ : passengers currently boarding and alighting through doors 1 and 2 were  
 28 associated, respectively, with doors 1 and 2; those currently boarding and alighting through  
 29 doors 3 and 4 were associated, respectively, with doors 4 and 3.

30 The data referred to the current situation (scenario  $S_0$ ) allowed for the calculation of:

- 31 • total dwell time, by adding dwell time over all stops;
- 32 • total running time, by adding the timeframes when doors are closed;
- 33 • total trip time, by adding total boarding time and total running time.

34 The total dwell time will vary according to the scenarios, whereas the total running time  
 35 is assumed to be constant throughout the different scenarios. Scenario  $S_0$  is used to validate the  
 36 regression model by matching computed total dwell time with the current situation. For scenarios  
 37  $S_1$ ,  $S_2$  and  $S_3$  mandatory smart-card validation has been simulated by adding a 1- to 3-second  
 38 delay per person boarding; consequently, for each scenario, three sub-scenarios were compared



1 (+1s, +2s, +3s); the reasons are:

- 2 • exact or estimated validation times taken from the literature were found to be irrelevant  
 3 as they refer to specific and very diverse urban environments and transport systems, not suitable  
 4 to Torino PT;  
 5 • validation time may present high variability as it depends on the type of travel documents  
 6 (e.g. smart-card or single ticket) and on traveller speed (8,9).

7 Afterwards, the necessary timeframes between the opening and the closing of each door  
 8 were calculated and the simulated dwell time was assumed as time related to the door with the  
 9 largest timeframe for each stop.

10 For each trip and scenario, the single dwell times and the total dwell times were  
 11 simulated. By adding up the total dwell and running time, the commercial speed – for each trip  
 12 and scenario – was calculated.

13 Trips were divided into subgroups corresponding to different headways, both during the  
 14 week and the weekend, in order to identify the number of vehicles needed to maintain the current  
 15 level of service:

- 16 • weekdays:  
 17 – from 7:00 to 9:00 6 minutes headway  
 18 – from 9:00 to 16:00 7 minutes headway  
 19 – from 16:00 to 20:00 8 minutes headway  
 20 • weekends:  
 21 – Saturdays 10 minutes headway  
 22 – Sundays 16 minutes headway.

23 Finally, according to GTT practice, dwell time is considered to be 5 minutes at the arrival  
 24 terminus.

## 25 RESULTS

26 Regression analyses were carried out on data referring to both weekdays and weekends. Table 2  
 27 reports the model parameters as well as the corresponding standard errors (Se).  
 28

29 **TABLE 2 Regression model parameters (weekdays and weekends)**

30

|                                  | Weekdays  |       | Weekends  |       |
|----------------------------------|-----------|-------|-----------|-------|
| Adjusted R <sup>2</sup>          | 0.497     |       | 0.378     |       |
| Y                                | $\beta_i$ | Se    | $\beta_i$ | Se    |
| c                                | 7,060***  | 0.408 | 8,584***  | 0.550 |
| Nmax <sub>a</sub>                | 1,347***  | 0.157 | 1,030***  | 0.135 |
| Nmax <sub>b</sub>                | 1,627***  | 0.188 | 1,044***  | 0.290 |
| % <sub>occ</sub>                 | -0.138*** | 0.032 | –         | –     |
| N <sub>a</sub> <sup>2</sup>      | -0.031**  | 0.011 | –         | –     |
| N <sub>b</sub> <sup>2</sup>      | -0.066**  | 0.021 | 0.081*    | 0.034 |
| % <sub>occ</sub> <sup>2</sup>    | 0.003***  | 0.001 | –         | –     |
| N <sub>a</sub> *N <sub>b</sub>   | -0.080*   | 0.036 | –         | –     |
| N <sub>b</sub> *% <sub>occ</sub> | 0.017**   | 0.006 | –         | –     |
| N <sub>a</sub> *% <sub>occ</sub> | –         | –     | –         | –     |

\* significant at p <0.05; \*\*significant at p <0.01; \*\*\*significant at p <0.001

32

33

The intercept estimate (c) is the timeframe during which the doors are open without

1 passenger flow: such timeframe covers the mechanical time necessary for opening and closing  
2 the doors and the time taken by the operator between the last passenger boarding and the  
3 activation of the door lock device. The mechanical opening/closing time is nearly 6 seconds (3  
4 for opening, 3 for closing) and the driver operation (door lock) can vary according to his/her  
5 alertness.

6 During the week, according to the model, alighting time per person is slightly lower ( $\beta_1=$   
7 1.347 s) than boarding time ( $\beta_2 = 1.627$  s), which is consistent with the current literature. The  
8 negative coefficients of the squared values of the number of people boarding ( $\beta_5= -0.066$ ) and  
9 alighting ( $\beta_4= -0.031$ ) signify a decrease of marginal (boarding or alighting) time with the  
10 increase of passengers going through doors, or, mathematically, that the second derivative of  
11 time is negative. Thus, dwell time at crowded stops will be less affected by the presence of  
12 additional travellers than dwell time at less crowded stops. Then, the load factor has a non-linear  
13 effect on dwell time ( $\beta_3=-0.138$ ,  $\beta_6=0.003$ ) that drops digressively when loadings increase.

14 The interaction between the number of alighting and boarding passengers leads to a  
15 reduction of the dwell time ( $\beta_7= -0.080$ ); this effect can be explained by assuming there are  
16 parallel flows of people getting in and out, allowed by the width of the doors. On the contrary,  
17 the interaction between the number of boarding passengers and the load factor increases the  
18 boarding time ( $\beta_8 =0.017$ ); this is consistent with the notion of friction between boarding and on-  
19 board passengers.

20 During the weekends, fewer variables influence the boarding time; the average time per  
21 passenger is lower than for weekdays and very similar for boarding ( $\beta_2= 1.04$  s) and alighting  
22 ( $\beta_1=1.03$  s). Another difference between the weekend and weekdays is the presence, on  
23 weekends, of an increased marginal time per boarding passenger, significant (p-value <0.05)  
24 even though quite small ( $\beta_5=0.08$ ).

25 Finally, on weekends, loadings do not have a significant impact on dwell time. The first  
26 hypothesis was that vehicle loadings are lower during weekends than during weekdays,  
27 explaining why the regression model was insensitive to passenger flow variation. However, after  
28 comparing average loadings over single trips for both periods, no significant difference was  
29 observed, thus conflicting with the first hypothesis.

30 Table 3 shows the main results for the different scenarios, focusing on the change of  
31 commercial speed ( $V_{comm}$ ) and, consequently, on the number of vehicles required to avoid both  
32 an increase of the waiting time at the bus stop and an increase of the overall travel time.

33 The simulation of scenario 0 (two-way working doors and non-mandatory smart-card  
34 validation) represents the current situation very well, revealing the good fit of the model. The  
35 computed Total Dwell Time (TDT) slightly differs from the current scenario: the maximum  
36 difference (-2.69%) is recorded for the weekdays from 09:00 to 16:00. The predicted commercial  
37 speed fits the current one well, showing a maximum difference of +0.34%, recorded for the same  
38 time slot (weekdays, 9:00-16:00). Observed and simulated TDT range from 11% (morning  
39 period) to 15% (Sunday) of the total trip time, confirming the lower impact of TDT during peak  
40 time, as consistent with state-of-the-art literature (15).

41 The good fit of the model justifies its use to estimate the effects of mandatory validation  
42 on the different scenarios.

43 Scenario 1 (two-way working doors and mandatory smart-card validation) is slightly critical,  
44 notably in the two peak-periods (07:00 - 09:00 and 16:00 - 20:00), when all sub-scenarios would  
45 require a supplementary vehicle in order to avoid an increase of the waiting time. The worst sub-  
46 scenario (+3 s/pax to validate) causes a non-negligible decrease of the commercial speed (> -  
47 4.5%) for all the considered periods. Nevertheless, such a scenario would not affect the

1 **TABLE 3 Results of simulations of the different scenarios**

2

|                   |                         | Current    | S <sub>0</sub> | S <sub>1</sub> +1s | S <sub>1</sub> +2s | S <sub>1</sub> +3s | S <sub>2</sub> +1s | S <sub>2</sub> +2s | S <sub>2</sub> +3s | S <sub>3</sub> +1s | S <sub>3</sub> +2s | S <sub>3</sub> +3s |
|-------------------|-------------------------|------------|----------------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|--------------------|
| Weekdays<br>7-9   | TDT [s]                 | 460.60     | 466.03         | 538.33             | 592.41             | 659.16             | 597.66             | 737.62             | 880.42             | 564.52             | 654.03             | 752.23             |
|                   | Δ TDT/current mean      |            | 1.18%          | 16.88%             | 28.62%             | 43.11%             | 29.76%             | 60.14%             | 91.15%             | 22.56%             | 41.99%             | 63.31%             |
|                   | Total trip time [s]     | 4124.40    | 4129.83        | 4202.13            | 4256.21            | 4322.96            | 4261.46            | 4401.42            | 4544.22            | 4228.32            | 4317.83            | 4416.03            |
|                   | Vcomm [km/h] / [mi/h]   | 12.3 / 7.6 | 12.3 / 7.6     | 12.1 / 7.5         | 11.9 / 7.4         | 11.7 / 7.3         | 11.9 / 7.4         | 11.5 / 7.2         | 11.2 / 6.9         | 12 / 7.4           | 11.7 / 7.3         | 11.5 / 7.1         |
|                   | Δ Vcomm/current mean    |            | -0.13%         | -1.85%             | -3.10%             | -4.59%             | -3.22%             | -6.29%             | -9.24%             | -2.46%             | -4.48%             | -6.60%             |
|                   | N. veh. (suppl/current) | 24.58 (0)  | 24.61 (0)      | 25.01 (1)          | 25.31 (1)          | 25.68 (1)          | 25.34 (1)          | 26.12 (2)          | 26.91 (2)          | 25.16 (1)          | 25.65 (1)          | 26.20 (2)          |
| Weekdays<br>9-16  | TDT [s]                 | 488.20     | 475.04         | 551.43             | 628.73             | 701.32             | 647.07             | 806.97             | 966.87             | 605.94             | 671.43             | 779.81             |
|                   | Δ TDT/current mean      |            | -2.69%         | 12.95%             | 28.79%             | 43.66%             | 32.54%             | 65.29%             | 98.05%             | 24.12%             | 37.53%             | 59.73%             |
|                   | Total trip time [s]     | 3929.60    | 3916.44        | 3992.83            | 4070.13            | 4142.72            | 4088.47            | 4248.37            | 4408.27            | 4047.34            | 4112.83            | 4221.21            |
|                   | Vcomm [km/h] / [mi/h]   | 12.9 / 8   | 12.9 / 8       | 12.7 / 7.9         | 12.5 / 7.7         | 12.2 / 7.6         | 12.4 / 7.7         | 11.9 / 7.4         | 11.5 / 7.1         | 12.5 / 7.8         | 12.3 / 7.7         | 12 / 7.5           |
|                   | Δ Vcomm/current mean    |            | 0.34%          | -1.58%             | -3.45%             | -5.14%             | -3.89%             | -7.50%             | -10.86%            | -2.91%             | -4.46%             | -6.91%             |
|                   | N. veh. (suppl/current) | 20.14 (0)  | 20.08 (0)      | 20.44 (0)          | 20.81 (0)          | 21.16 (1)          | 20.90 (0)          | 21.66 (1)          | 22.42 (2)          | 20.70 (0)          | 21.01 (1)          | 21.53 (1)          |
| Weekdays<br>16-20 | TDT [s]                 | 497.67     | 485.86         | 574.86             | 663.86             | 752.86             | 695.52             | 844.97             | 1012.31            | 622.87             | 741.75             | 862.71             |
|                   | Δ TDT/current mean      |            | -2.37%         | 15.51%             | 33.39%             | 51.28%             | 39.76%             | 69.79%             | 103.41%            | 25.16%             | 49.05%             | 73.35%             |
|                   | Total trip time [s]     | 4194.67    | 4182.86        | 4271.86            | 4360.86            | 4449.86            | 4392.52            | 4541.97            | 4709.31            | 4319.87            | 4438.75            | 4559.71            |
|                   | Vcomm [km/h] / [mi/h]   | 12.1 / 7.5 | 12.1 / 7.5     | 11.9 / 7.4         | 11.6 / 7.2         | 11.4 / 7.1         | 11.5 / 7.2         | 11.2 / 6.9         | 10.8 / 6.7         | 11.7 / 7.3         | 11.4 / 7.1         | 11.1 / 6.9         |
|                   | Δ Vcomm/current mean    |            | 0.28%          | -1.81%             | -3.81%             | -5.73%             | -4.50%             | -7.65%             | -10.93%            | -2.90%             | -5.50%             | -8.01%             |
|                   | N. veh. (suppl/current) | 18.73 (0)  | 18.68 (0)      | 19.05 (1)          | 19.42 (1)          | 19.79 (1)          | 19.55 (1)          | 20.17 (2)          | 20.87 (2)          | 19.25 (1)          | 19.74 (1)          | 20.25 (2)          |
| Saturdays         | TDT [s]                 | 545.00     | 538.06         | 611.81             | 661.56             | 737.53             | 775.05             | 893.77             | 1040.52            | 698.92             | 816.06             | 935.79             |
|                   | Δ TDT/current mean      |            | -1.27%         | 12.26%             | 21.39%             | 35.33%             | 42.21%             | 63.99%             | 90.92%             | 28.24%             | 49.74%             | 71.70%             |
|                   | Total trip time [s]     | 3780.75    | 3773.81        | 3847.56            | 3897.31            | 3973.28            | 4010.80            | 4129.52            | 4276.27            | 3934.67            | 4051.81            | 4171.54            |
|                   | Vcomm [km/h] / [mi/h]   | 13.4 / 8.3 | 13.4 / 8.3     | 13.2 / 8.2         | 13 / 8.1           | 12.8 / 7.9         | 12.6 / 7.9         | 12.3 / 7.6         | 11.9 / 7.4         | 12.9 / 8           | 12.5 / 7.8         | 12.2 / 7.5         |
|                   | Δ Vcomm/current mean    |            | 0.18%          | -1.74%             | -2.99%             | -4.85%             | -5.74%             | -8.45%             | -11.59%            | -3.91%             | -6.69%             | -9.37%             |
|                   | N. veh. (suppl/current) | 13.60 (0)  | 13.58 (0)      | 13.83 (0)          | 13.99 (0)          | 14.24 (1)          | 14.37 (1)          | 14.77 (1)          | 15.25 (2)          | 14.12 (1)          | 14.51 (1)          | 14.91 (1)          |
| Sundays           | TDT [s]                 | 541.00     | 541.04         | 625.54             | 647.56             | 742.03             | 848.87             | 997.84             | 1168.34            | 760.72             | 901.02             | 1042.57            |
|                   | Δ TDT/current mean      |            | 0.01%          | 15.63%             | 19.70%             | 37.16%             | 56.91%             | 84.44%             | 115.96%            | 40.61%             | 66.55%             | 92.71%             |
|                   | Total trip time [s]     | 3700.00    | 3700.04        | 3784.54            | 3806.56            | 3901.03            | 4007.87            | 4156.84            | 4327.34            | 3919.72            | 4060.02            | 4201.57            |
|                   | Vcomm [km/h] / [mi/h]   | 13.7 / 8.5 | 13.7 / 8.5     | 13.4 / 8.3         | 13.3 / 8.3         | 13 / 8.1           | 12.7 / 7.9         | 12.2 / 7.6         | 11.7 / 7.3         | 12.9 / 8           | 12.5 / 7.8         | 12.1 / 7.5         |
|                   | Δ Vcomm/current mean    |            | 0.00%          | -2.23%             | -2.80%             | -5.15%             | -7.68%             | -10.99%            | -14.50%            | -5.61%             | -8.87%             | -11.94%            |
|                   | N. veh. (suppl/current) | 8.33 (0)   | 8.33 (0)       | 8.51 (0)           | 8.56 (0)           | 8.75 (0)           | 8.97 (0)           | 9.29 (1)           | 9.64 (1)           | 8.79 (0)           | 9.08 (1)           | 9.38 (1)           |

3

1 operational requirements to satisfy the demand on Sunday. In fact, although the +3s sub-scenario  
2 causes a considerable decrease of the commercial speed (-5.15%, the second highest value in  $S_3$ ),  
3 the number of vehicles currently used in this time period allows such a drawback to be  
4 overcome, avoiding adding another one, as required for the other periods. For the  $S_{1+3s}$  scenario,  
5 the share of TDT on total trip time increases from 15% (morning period) to 17% (afternoon and  
6 evening period) and to 19% for the weekend. Scenario 2 (boarding from the front door only,  
7 mandatory smart-card validation and alighting through all other doors) is the most critical one,  
8 requiring at least one supplementary vehicle for all time periods and sub-scenarios, except for the  
9 "+1s" scenario in the off-peak period during the week and on Sunday.

10 In this latter case the decrease of commercial speed is important (-7.68%), but the number  
11 of vehicles currently used in  $S_0$  would allow the current quality of service to be maintained. The  
12 most serious deficiencies would clearly occur in the "+3s" sub-scenario: a) two supplementary  
13 vehicles needed for all time-periods except Sunday, despite the great decrease of commercial  
14 speed (-14.5%); and b) the highest impact of the simulated TDT on the total trip time (27%) for  
15 the two peak-periods on the weekdays, when two supplementary vehicles would also be required  
16 in the "+2s" sub-scenario. The " $S_{3+1s}$ " sub-scenario (boarding from the front and the rear doors,  
17 mandatory smart-card validation and alighting through middle doors) would not require any  
18 supplementary vehicle as regards the two similar cases of " $S_{2+1s}$ ": the off-peak period on  
19 weekdays and on Sunday. The same cannot be said of the "+3s" sub-scenario, which would  
20 require two supplementary vehicles to avoid any increase in the waiting time at the bus stop  
21 during the morning and evening peak-periods on weekdays.

22 In this case, the share of TDT on total trip time varies from 17% in the morning period to  
23 25% on Sunday. For all other sub-scenarios, only one supplementary vehicle would be needed.  
24 The observed values of the average commercial speed differ according to the different time  
25 periods, due to the change of both running time (mainly affected by traffic conditions) and dwell  
26 time. The lowest commercial speed is observed in the evening peak-period, followed by the  
27 morning period, the weekday off-peak period and, finally, Saturday and Sunday. For the different  
28 scenarios, the commercial speed varies only in function of the dwell time which, in turn, depends  
29 on the different use of the doors and on the different delays considered for mandatory validation.

## 30 **DISCUSSION AND CONCLUSIONS**

31 The regression model offers a good estimate of dwell times, notably for weekday trips, and the  
32 estimates of boarding and alighting times per passenger are consistent with the existing  
33 literature:

- 34 • results for weekdays show a dwell time equal to 7 seconds idling time plus 1.627s per  
35 boarding passenger; Levinson (16) proposed considering 5 seconds idling time plus 2.75s per  
36 boarding passenger;
- 37 • Sun et al. (13) found that high occupancy slows down boarding; the estimate of  
38 interaction between boarding and load factor confirms this phenomenon;
- 39 • estimates of boarding time (1.627s) and alighting time per passenger (1.347s) are  
40 remarkably close to values suggested by the TCQS Manual (15): 1.5s per boarding passenger  
41 and from 1.2 to 1.8 s per alighting passenger. These values are proposed for a situation with two  
42 available doors, comparable to our situation where, although 4 doors are available, only two of  
43 them are wide enough to allow simultaneous boarding/alighting passenger flows.

44 Observed data highlight that in the current situation, with two-way working doors, the  
45 passengers prefer both to board and alight through doors 2 and 3 (which together account for  
46 65% of the total flows, mainly for alighting), while doors 1 and 4 are less used and then mainly  
47

1 for boarding. This may be due to the bus layout, which has less space in the front, due to the  
2 driver cabin. The length of the bus (18 m) may explain lower use of door 4, which is sometimes  
3 less accessible from the platform.

4 The results from the scenario simulations will allow GTT to carry out an economical  
5 evaluation and take the best decision in order to satisfy both operational and user needs. From  
6 the Company's point of view, the most critical scenarios would be the ones entailing the  
7 abolition of two-way working doors ( $S_2$  and  $S_3$ ), particularly if the boarding would then be  
8 allowed only through only one door ( $S_2$ ). The company should indeed increase the number of  
9 circulating buses in order to guarantee the same level of service. However, such a change may  
10 lead to positive consequences, such as a tidier boarding process and a greater propensity to  
11 validate, since in  $S_2$  the boarding would occur through the door next to the driver. The company  
12 could benefit from a lower fraud rate and its public image would benefit from that. Furthermore,  
13 the introduction of canalised flows would encourage the passengers to occupy areas currently  
14 underused, such as corridors and the inner parts of the buses. As a consequence, crowding would  
15 decrease in the door areas, creating less friction among the passengers during boarding and  
16 alighting.

17 The variation of the number of buses needed depends on validation time: the same  
18 number of buses is required both for Scenario 2 (boarding through the front door – door 1) with 2  
19 s of validation time and for Scenario 3 (boarding through doors 1 and 4) with 3 s of validation  
20 time.

21 The suppression of two-way working doors could be quite unfavourable, particularly if  
22 implemented together with the introduction of mandatory validation. Passengers who are still not  
23 used to the new practice, may take a rather long time to validate. Considering the lack of precise  
24 data related to the effective validation time, the choice to keep the two-way working doors would  
25 need more thought, perhaps requiring an initial test period to evaluate the magnitude of the  
26 impact produced by the validation.

27 In fact, a test period would allow the real changes produced by mandatory validation to  
28 be assessed and also, notably, precise data about the average validation time to be collected.  
29 Afterwards, the introduction of channelled flows may be considered and possibly tested. Of  
30 course, the different proofs-of-payment which may be used for validation entail different  
31 validation times and, thus, different Total Dwell Times. Tirachini (9) proved that, compared to  
32 the absence of validation, the increase of the boarding time varies from 1% to 17% with the use  
33 of a smart card, from 26% to 77% with the use of a magnetic card, and from 241% to 619% with  
34 on-board payment. Compared to the magnetic card, the use of a smart card allows saving from  
35 22% to 51% of boarding time.

36 The study has highlighted the great importance of having precise data concerning  
37 passenger counts. This information, used to analyse the dwell time, allows transport companies  
38 to partially understand their user habits and the effective use of the PT service; these are, of  
39 course, key elements for proper and efficient management of the transport system. To this extent,  
40 it would be crucial to take advantage of more efficient and automatic data collection methods,  
41 given the problems faced during the manual data collection.

42 For the time being, GTT has introduced mandatory validation and it is trying to  
43 encourage users to validate by means of an intensive advertising campaign. Estimates from the  
44 company show that less than 20% of passengers validate. Such a figure reflects the difficulty  
45 users experience when the buses are crowded, discouraging virtuous behaviour. From the city's  
46 perspective, the introduction of mandatory validation is expected to trigger more revenue from  
47 tickets sales and less free ridership thanks to social control over the validation. Indeed, the city

1 being the owner of GTT, both a lower financial contribution and a lower dependency on  
2 transport authority subsidies would alleviate the current expenditures, which are continuously  
3 challenged due to the decrease of regional funds. Nevertheless, the decrease of commercial speed  
4 will require a greater number of vehicles in order to maintain a constant waiting time at stops,  
5 implying that the service must be optimised to tackle the current budget restrictions. However,  
6 the mix of mandatory validation with other policies such as traffic priority schemes for PT  
7 services, can induce an increase in the quality of service in the coming years.

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