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# Measuring the interactions between air traffic control and flow management using a simulation-based framework

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**Abstract:** Air traffic in Europe is predicted to increase considerably over the next decades. In this context, we present a study of the interactions between the costs due to ground-holding regulations and the costs due to en-route air traffic control. We describe a traffic simulator that considers the regulation delays, aircraft trajectories, and air conflict resolution. Through intensive simulations based on traffic forecasts extrapolated from French traffic data for 2012, we compute the regulation delays and avoidance maneuvers according to two scenarios: the current regulations and no regulations. The resulting cost analysis highlights the exponential growth in regulation costs that can be expected if the procedures and the airspace capacity do not change. Compared to the delay costs, the costs of the air traffic control are negligible with or without regulation. The analysis reveals the heavy controller workloads when there are no regulations, suggesting the need for regulations that are appropriate for large traffic volumes and an improved ATC system. These observations motivate the design of a third scenario that computes the sector capacities to find a compromise between the increase in the delay costs due to ground-holding regulations and the increase in the controller workload. The results reveal the sensitivity of the delay costs to the sector capacity; this information will be useful for further research into ATM sector capacity and ATC automated tool design. Finally, because of the growing interest in the free flight paradigm, we also perform a traffic and cost analysis for aircraft following direct routes. The results obtained highlight the fuel and time savings and the spatial restrictions that companies use to avoid congested areas.

**Key Words:** Air traffic control, conflict resolution, air traffic management, ground-holding regulation.

# 1 Introduction

## 1.1 Context and main concepts

Delays in air traffic can arise from many sources, including the regulations required to avoid congestion on the network. In Europe in 2012, the average delay due to regulations reached 1.15 minutes per flight [1]. According to the latest long-term forecast issued by EUROCONTROL [2], traffic volumes are predicted to increase by 20% to 80% between 2012 and 2035, resulting in much higher congestion around and between airports and increased regulation delays. Joint European projects that are currently underway aim to remodel air traffic management (ATM) in Europe to adapt it to future traffic flow characteristics. Many of these projects are included in the SESAR (Single European Sky ATM Research) program [3]. One of SESAR's main objectives is to set up trajectory-based management, where companies and regulation units negotiate trajectories that satisfy both their economic objectives and congestion constraints. Such a design would allow pilots to fly under the free flight rules [4], following paths that are more beneficial than predefined routes that form a network structure.

Currently, the European ATM system is composed of several layers with different time horizons, aiming to safely and efficiently handle the flow of aircraft. A few months in advance, the airspace management filter is triggered. It defines the structure of the route network and the navigation procedures. The airspace is divided into control sectors, which are three-dimensional regions that are each the responsibility of a pair of controllers.

To maintain the workload of the controllers at an acceptable level, each control sector has a *capacity*, defined as the maximum number of aircraft entering the sector in one hour (typically, between 20 and 40 aircraft per hour for a control sector in Europe). Airspace capacity estimation methods have already been developed. A study estimating the airspace capacity in Europe as a combination of different types of air traffic movement in different sectors has been performed [5]. More recently, a simulation-based approach has been designed by Steiner and Krozel [6]. They used ensemble-based weather forecasts to generate probability distributions of airspace capacities. Their model has been extended by Clarke et al. [7], who developed a more general model including an air traffic control (ATC) module and capturing traffic-related uncertainties. However, they did not analyze the costs incurred or the impact on the network.

From a few days to a few hours in advance, air traffic flow management (ATFM) regulates the traffic to enforce the sector capacities. This task is assigned to the Central Flow Management Unit (CFMU), whose work relies on traffic predictions, built on pilots' flight plans. During peak periods, the CFMU issues ground-holding regulations for flights over congested areas of the airspace by automatically assigning take-off slots via the computer assisted slot allocation (CASA) algorithm, which works in a greedy *first-planned, first-served* fashion. The ground-holding problem (GHP) was defined in 1994 by Vranas et al. [8] and has been widely studied since. The techniques include stochastic models [9] and shortest path problems [10]. Since congestion in the United States is primarily related to important hubs whereas in Europe both airspace and airport capacities can cause congestion issues, most studies focus on European traffic. For instance, the difficulties and potential improvement points of European ATFM have been studied in [11].

ATC aims to manage air traffic on a short-term horizon. The main tasks of the controllers are to monitor the traffic and to keep the aircraft separated by at least 5 NM horizontally or 1000 ft vertically, as depicted in Figure 1. To resolve conflict situations, i.e., to avoid predicted losses of separation between two or more aircraft, the controllers issue maneuvers to the pilots. These maneuvers involve changes in the speed, heading, or flight level, and they induce costs due to fuel consumption and delays.

A study of traffic complexity [12] states that if the traffic becomes twice as dense, no controller will be able to monitor and issue maneuvers without an automated tool, which indicates the need for optimization in this domain. Automated ATC has been thoroughly studied, and numerous algorithms have been developed. The literature on aircraft conflict detection and resolution is vast; the techniques applied include mixed integer linear programming [13, 14], nonlinear programming [15, 16], metaheuristics [17, 18], semidefinite programming [19], and force field models [20]. See [21] for a comprehensive survey.

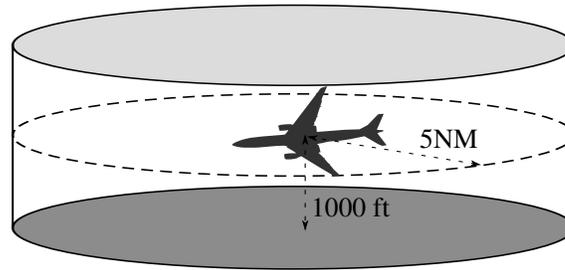


Figure 1: Vertical and horizontal separation. No other aircraft can be inside the cylinder at the same time.

Direct routing has received little attention, although it has been shown to have economic advantages for airlines: it leads to shorter flight times and reduced fuel costs [22].

## 1.2 Critical analysis and contribution statement

The performance of automated conflict solvers depends on the number and complexity of the conflicts, which are related to the sector capacities. Despite the diversity of the literature, we have not found any work involving automated conflict resolution and the extrapolation of real traffic data to predict future traffic. The studies in [14, 23] base their computational tests on historical traffic data, but they do not provide a thorough analysis of the costs and the interactions with the other layers of ATM. A study involving an estimation of future traffic is fundamental for a better understanding of future situations and their inherent difficulties. It is also important to study the nature of the relationship between the costs incurred by airports and the en-route regulations. An understanding of the economic impact would allow us to take advantage of these interactions.

In this paper, we present a simulation framework that allows us to study the relationship between the ATFM and the ATC. We focus on the ground-holding and operational costs and the controller workload in a context of increasing traffic. Using the reference values of [2, 24], we develop a procedure to forecast the traffic until 2035 using French data for 2012. Our model provides an excellent platform for the evaluation of automated tools for air conflict resolution, since it allows the evaluation of a variety of traffic scenarios, both independently and jointly. We apply three different ATFM regulation scenarios to the generated traffic, to study how the ground-holding affects the conflict resolution and to find a compromise between high regulation costs and heavy workloads. To this end, we perform a state-of-the-art estimation of the delay costs and identify relevant measures of the workload, each related to a different subtask: monitoring, coordination, or communications.

We also perform a study of direct routes. This provides important information on the ATM costs since longer, indirect routes are usually the result of the route network and the weather conditions. The network structure of the airspace becomes irrelevant when we consider direct routes. As a consequence, the current regulations no longer apply. Taking this into account, we use our simulation framework to study the consequences in terms of fuel gain and air conflict resolution. The results provide insight into how companies use restrictions to adapt to the traffic.

Moreover, our study highlights the geographic regulations that reduce congestion in some heavily loaded sectors. More precisely, we obtain insight into the effect of the number and complexity of conflicts.

## 2 Description of the simulation algorithms

The study of the interactions between planning and control requires several automated procedures: a trajectory simulator, a regulation algorithm, and a conflict solver. Figure 2 provides an overview, with references to the sections in which we discuss each component.

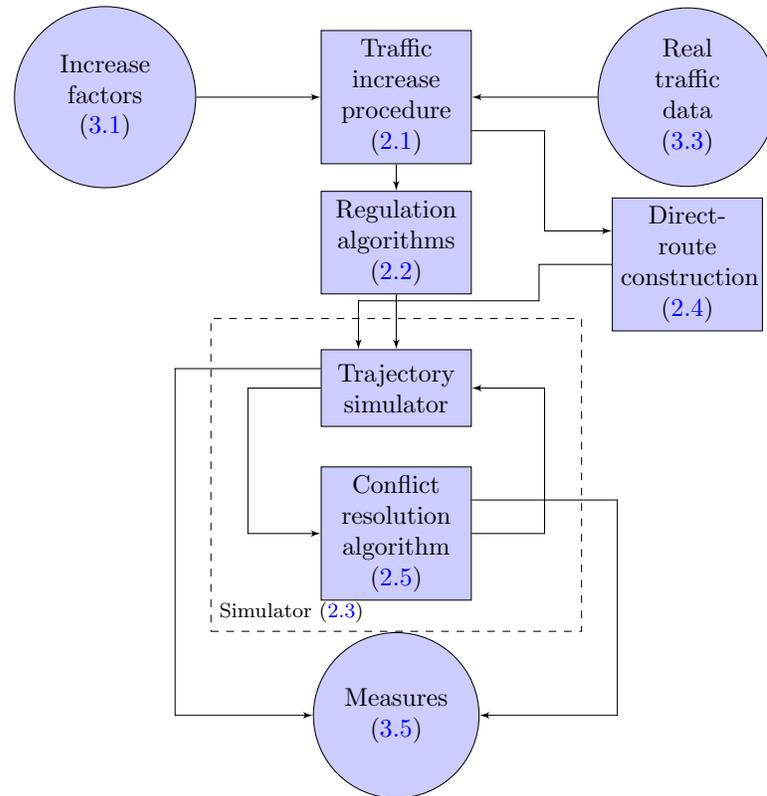


Figure 2: Simulation modules.

## 2.1 Traffic increase

To increase the traffic to reflect the available forecasts, we used a procedure parametrized by a multiplying factor. Given an increase factor  $f$  (e.g.,  $f = 0.4$  for a 40% increase) and an initial set  $T$  of  $n$  flights,  $n_+ = f \times n$  new flights are created. To create a new flight, we randomly choose a flight in  $T$  and create a copy with a small random modification to its departure time. The random shift typically lies in  $[-15, -1] \cup [+1, +15]$  minutes to avoid the exact duplication of the flight. Excluding the interval  $(-1, 1)$  ensures aircraft separation, since an offset of one minute for aircraft taking off at 150 kts ensures a separation of 2.5 NM.

The main advantage of this method is that it maintains a similar distribution of the departure times over a day of traffic. Indeed, the random shift tends to broaden and flatten the peaks of the distribution, hence giving a conservative lower bound on the actual distribution. A more realistic forecast would be based on a market study carried out on a global scale, but such information is not yet available.

A drawback of duplicating flights in this fashion is the creation of conflicts with pursuing aircraft. Depending on the random shift, the process may lead to flights that follow each other very closely. To overcome this, we impose a regulation at each airspace entry point to enforce the necessary separation between the flights.

## 2.2 Regulation

The regulations imposed by the CFMU affect the flights crossing regulated areas. These areas are determined on a daily basis by experts, depending mainly on the expected traffic. In a given regulated area, the departure slots are allocated following a *first planned, first served* scheme, meaning that there are no restrictions on the order in which aircraft enter the area.

Figure 3 gives a flowchart of the algorithm described in [25] for a given regulated area. For each such area, CASA maintains a *slot allocation list*, which is a series of consecutive slots of equal length covering the

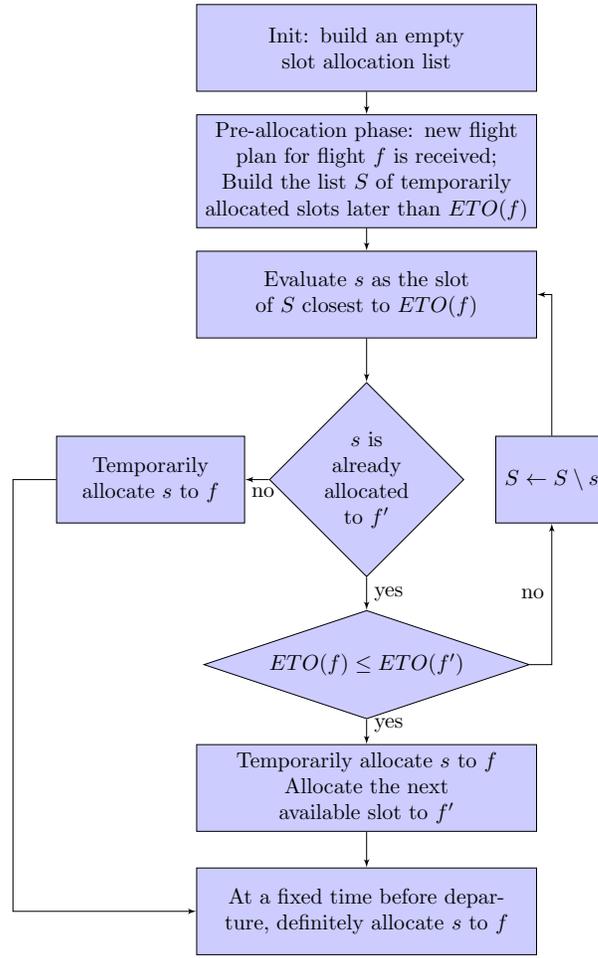


Figure 3: CASA procedure for a regulated area.

regulation period. For instance, a two-hour period with a capacity of 30 results in an allocation list with 60 two-minute slots. A flight crossing this area has a priority linked to its estimated time over (ETO) the point where it enters the area: the earlier the ETO, the higher the priority. It is important to notice the cascade effect of this mechanism. Reallocating slots to flights can have consequences for other flights that must also be reallocated, hence increasing the number of delays in the network. One limitation of this algorithm is the independent regulation of each area. If a given flight is regulated in two or more areas, its departure slot must satisfy the most restrictive regulation, which may violate constraints in the other areas.

We implement the CASA algorithm in our simulation engine. The exact regulation areas are unavailable, so they are assumed to coincide with the 2012 control sectors. This assumption differs from the CFMU's procedure in which the areas are determined depending on factors such as weather conditions. Also, for the capacities we used nominal sector capacities from 2012, since we could not find more accurate data.

### 2.3 Trajectory simulation

The flight simulations are performed by the Complete Air Traffic Simulator (CATS) [26]. CATS is an en-route air traffic simulation engine based on a time-discretized execution model, i.e., the position and velocity vectors of every aircraft are computed at times separated by a period  $\tau$  set by the user. The aircraft specifications and performance, such as the horizontal and vertical speeds and the fuel consumption, are extracted from the Base of Aircraft Data (BADA) summary tables based on the total energy model [27]. The simulation engine processes data corresponding to real flight plans and gives detailed outputs including traffic

statistics, sector occupation at any time, and a thorough examination of the conflicts: geometry, duration, and conflict-resolution statistics.

## 2.4 Direct routes

Our simulation engine includes a module transcribing a given traffic scenario into its equivalent in direct routing. The aircraft fly along the orthodromic path, i.e., they take the shortest path between origin and destination on the ellipsoidal Earth satisfying the World Geodesic System 84 (WGS84) standards. A more sophisticated approach to direct routing would be to choose the path that optimizes fuel consumption while considering weather conditions. However, the orthodromic path provides a good lower bound on the fuel gains.

For a realistic comparison between current traffic and direct routing, we start by increasing the current traffic and then we convert it into traffic with direct routes. This allows us to compare the same traffic under two different paradigms.

The use of direct routes introduces questions about the notion of an air sector. The network of predefined routes is designed to provide sectors that are manageable for air traffic controllers. With direct routes this network does not exist, making it difficult to consider sectors. As a consequence, the current ground-holding regulations, which rely on sector occupancy, no longer seem relevant. These observations lead us to simulate direct traffic without the ATFM regulations. It is still possible to get insight into the traffic physiognomy in terms of traffic flow and air conflicts.

## 2.5 Conflict resolution

Our goal is not to study the performance of a particular algorithm or to prove that it is suitable for practical implementation. The conflict resolution module is used only to estimate the costs incurred by the maneuvers that are necessary to maintain the aircraft separation. It is impossible to precisely correlate the costs of the maneuvers designed by an automated conflict solver with those selected by a controller, but the order of magnitude is the same.

The conflict resolution algorithm designed by Durand et al. in [17] is used in the simulations because it is already embedded in CATS. In the first step, conflicts are detected over a 20-minute horizon, and they are aggregated into independent *clusters*. For instance, if aircraft *A* conflicts with aircraft *B* and aircraft *B* conflicts with aircraft *C*, then aircraft *A*, *B*, and *C* are aggregated into the same cluster. Each cluster is then deconflicted independently, using a genetic algorithm.

The genetic algorithm is based on the concepts described by Goldberg [28]. The principle is to manipulate a *population* where each *individual* is a candidate solution to the problem. The population is composed of *n* possible trajectories, one per aircraft. For a given aircraft, the possible trajectories correspond to the discretized set of permissible maneuvers: 7 heading-change values between  $-30^\circ$  and  $30^\circ$ , 5 speed changes between  $-6\%$  and  $+3\%$ , and, incidentally, altitude maneuvers corresponding to climb interruptions and descent anticipations.

The population is initialized with randomly generated maneuvers for each aircraft. At each step, the quantity to optimize, called the fitness, is computed for each individual, and the best individuals are selected according to their fitness. These individuals are used as inputs to the cross-over and mutation operators that aim to generate new individuals in the current population.

# 3 Simulation input

## 3.1 Traffic predictions

Medium- and long-term traffic forecasts are regularly issued by EUROCONTROL. Based on a thorough study of current traffic trends and statistics and recent air-industry-related events, the latest mid-term forecast

provides predictions for 2013 to 2019 [24], while the long-term forecast extends the analysis to 2035 [2]. Since the predictions depend on the evolution of the global economic situation, several scenarios are considered, and annual growth rates are estimated for each. Table 1 summarizes the long-term forecast [2].

Table 1: Summary of traffic forecast for Europe to 2035.

Scenario	Annual growth			
	Global Growth	Regulated Growth	Happy Localism	Fragmented World
2012–2019	3.4%	2.3%	2.3%	0.9%
2019–2020	3.7%	2.2%	1.5%	0.6%
2021–2025	2.5%	1.9%	1.5%	0.8%
2026–2030	2.2%	1.5%	1.2%	0.4%
2031–2035	1.9%	1.2%	1.1%	0.7%

The scenarios listed in Table 1 correspond to different assumptions about the future. Global Growth and Fragmented World depict two extremes situations in which the economic and political circumstances allow flourishing exchanges or cause a recession. In our computational tests, the increased traffic reflects the in-between Regulated Growth scenario, which is more likely. This scenario represents average economic growth along with regulations to address environmental and sustainability issues. A sufficient range of traffic-increase rates is then achieved by focusing on six specific years between 2014 and 2035. These years and the corresponding traffic rates are given in Table 2.

Table 2: Traffic predictions with regulated growth.

Year	2014	2017	2020	2025	2030	2035
Increase	+5%	+12%	+20%	+32%	+42%	+50%

## 3.2 Airspace capacity

CASA needs the capacity of each regulated area. As noted earlier, we used the nominal capacities of the sectors covering the French territory. We found no complete study providing an estimation of the evolution of these capacities. Moreover, our goal is to estimate the impact of automated conflict resolution, and this should not have a strong dependence on the capacity. For simplicity, we run the simulations with the following three scenarios:

- $S_1$  – the capacities remain constant;
- $S_2$  – the capacities are deleted: there is no regulation;
- $S_3$  – the capacities satisfy a condition corresponding to a controlled growth in the delay costs.

$S_1$  and  $S_2$  correspond to two extreme situations: in  $S_1$  nothing new is designed to handle greater traffic, and in  $S_2$  the traffic flows freely without any constraint. Our study of  $S_1$  will give a better understanding of the need to modify the current procedures. Focusing on  $S_2$  will enable us to quantify the effect of a worst-case scenario from the ATC point of view. Indeed,  $S_2$  should lead to the worst possible situation in terms of conflicts and the controller workload. Since the design of  $S_3$  is motivated by the results given in Section 4, we describe this scenario in Section 5.

## 3.3 Choice of the reference historical data

The study focuses on French traffic, because we were able to get traffic data and information on the sector capacities and geometry. Moreover, the French airspace is dense because it is a crossroads of various European hubs. We use data for the 2012 traffic over France in our tests. The simulations focus on Friday, June 8th because it was a busy day for which the actual delays were close to the delays that we computed with the nominal sector capacities. For illustration, Table 3 gives the number of flights, the computed delays, and

Table 3: Traffic statistics for 6/6/2012 to 6/12/2012.

Date	Number of flights	Computed delays (min)	CFMU delays (min)
6/6	8656	1835	4503
6/7	8723	1875	8845
6/8	9053	16086	15505
6/9	8469	5708	13215
6/10	8786	11075	10924
6/11	8817	5507	11449
6/12	8618	4739	8006
Average	8731.7	6689.3	10349.5

the actual CFMU delays for the week of June 6th to 12th. Although the numbers vary considerably, the computed data is valid since there is no extreme behavior. The flight volumes per day are similar. June 8th is the day with the greatest number of flights and the most delay. We choose this day to explore the difficulties related to the management of dense traffic.

### 3.4 Delay and maneuver costs

A study performed by EUROCONTROL [1] estimates that in 2012, ATFM delays in Europe cost €0.85 billion. For a given flight, the costs depend on a variety of factors, such as the operational conditions, the phase of flight where the delay occurs, the type and size of the aircraft, and the load factor. As a consequence, we need a large quantity of data for a thorough study of the cost model.

We focus on two main types of costs. First, we consider delays induced by maneuvers issued by the ATC. These costs depend on the maneuver model and on the air conflict solver used, since its performance will impact the commands issued. We observe again that if the traffic becomes twice as dense, no controller will be able to monitor and issue maneuvers without an automated tool [12]. Thus, a conflict solver is a valid tool for addressing the ATC costs. The planned maneuvers lead to extra fuel consumption. We use the model described in the BADA user manual [29] to compute the consumption, which depends mostly on the type, speed, and altitude of the aircraft. It is computed for three maneuvers: speed, heading, and altitude changes. Second, delay costs are introduced when the regulations lead to allocated slots that differ from the airlines' preferred slots. Modeling these costs properly is a complex task; the passenger, crew, and maintenance costs must be taken into account. It is also important to study the consequences of a delay on the whole network: one delay will lead to further delays in the rotation that includes the delayed flight.

In the literature, passenger costs are usually divided into “hard” costs representing compensation costs such as the cost of rebooking passengers, and “soft” costs such as the cost of passengers switching to another airline because of recurring delays. Joint work on this topic between the University of Westminster and EUROCONTROL resulted in a series of articles published between 2004 and 2011. The cost per minute per passenger of ground and airborne delays due to ATFM is derived in [30]. In [31], Cook and Tanner estimate the airline delay costs as a function of the delay magnitude. This function is combined with fuel consumption and future emission charges to derive a cost-benefit trade-off during the ground and airborne phases. In [32], the authors focus on the costs related to delay propagation in the network. Those delays can be either rotational (i.e., related to flights within the rotation) or nonrotational. Using values extracted from [33], the authors derive cost values that depend on the rotation structure, the aircraft involved, and the magnitude of the delay. The results from the earlier articles are collected in [34], which gives reference values for the delay costs incurred at both the strategic and tactical levels. The report presents cost values for all the phases of a flight: at-gate, taxi, cruise extension, and arrival. The values are assigned under different scenarios (low, base, and high), for twelve different aircraft types. Sample costs are given in Table 4 for the at-gate base scenario.

We use the costs that were computed under the base-case hypotheses in [34]. We also assume that companies ask for their preferred take-off slots. Thus, the slots allocated by CASA provide a valid estimate of the regulation-related delays.

Table 4: Tactical costs (euros, total) of ground-holding delay for different aircraft types.

Aircraft type	Delay (min)			
	15	60	120	240
B733	360	5780	29730	53720
B752	520	8780	45610	81610
B763	880	14510	84200	149510
B744	1230	20760	120940	213950
A320	410	6800	35280	63530
A321	470	8150	42460	76140

### 3.5 Measures of workload

The air traffic controllers' workload primarily consists of four tasks: monitoring the sector, coordinating the traffic with adjacent sectors, communicating with pilots, and maintaining separation. These tasks are demanding, and it is crucial to determine the impact of increased traffic on the controller workload. We define several performance indicators for the scenarios described in Section 3.2:

- the entering flow per hour for a sector, which is correlated with the monitoring and coordination;
- the number of conflicts, which is related to the complexity of maintaining separation;
- the number of conflict-resolution maneuvers, which affects both the monitoring and communications;
- a measure of the overcapacity per sector,  $OC(\cdot)$ , which impacts every indicator:

$$OC(s) = \sum_{h=1}^{24} \max\{0; f_s(h) - c_s\}^2 \quad (1)$$

where  $c_s$  is a reference capacity value for sector  $s$ , and  $f_s(h)$  is the entering flow of aircraft for sector  $s$  in a given hour  $h$ .

$OC(s)$  represents aggregated information on the overcapacity for sector  $s$  for a given regulation scenario. The greater the value of  $OC(s)$ , the more effort required from the controller. Moreover,  $OC(s)$  tends to penalize situations with high peaks over a short period of time more than situations with lower peaks that last longer. This is consistent for a measure of the controller workload, because a short, high peak is much harder to handle than a lower, broad peak.

## 4 Impact of the ground-holding regulation

### 4.1 Impact on the entering flow per hour

The airspace surrounding Reims is particularly challenging in terms of traffic complexity: the control sectors are quite small, and they include routes that connect important European hubs such as London, Milan, Zurich, and Frankfurt. We focus on the KR sector, which is a busy sector in the Reims control zone. The entering flow is studied as a congestion measure for KR. Figure 4 displays this measure for different volumes of traffic, i.e., the current traffic and the traffic increased by 32%, 42%, and 50%. For each traffic volume, statistics are extracted for scenarios  $S_1$  and  $S_2$ ; in  $S_1$  the CASA regulation is based on the nominal sector capacities of 2012, and in  $S_2$  there is no regulation. Another set of meaningful results related to  $OC(\cdot)$  can be found in Section 5.

Figure 4 clearly indicates that the flow depends on the presence or absence of regulation. Without regulation, the entering flow distribution tends to aggregate into a peak over the period from 10 a.m. to 12 a.m., leading to a large overcapacity. A threshold on the controller workload may thus be distinguished. Indeed, for traffic volumes greater than +32%, the entering flow per hour may exceed the capacity by more than 12 flights without regulation. This would require a tremendous monitoring effort. This suggests that increased traffic needs to be handled with modified regulations or with automated tools that decrease the

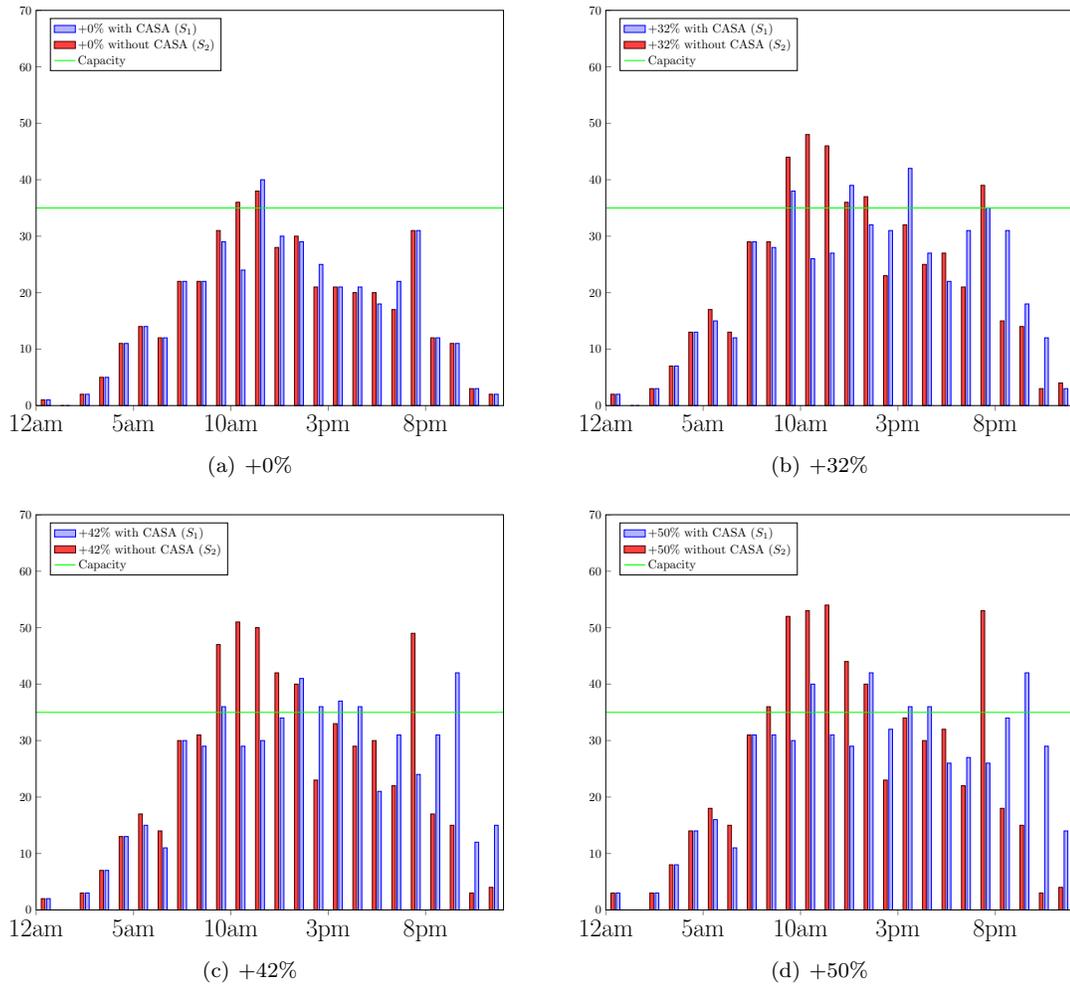


Figure 4: Entering flow per hour for different traffic volumes in KR sector.

controller workload. On the other hand, if regulation is present, it controls the entering flow to prevent overcapacity. However, the capacity is still exceeded in several cases; this is because of the difficulties the CASA algorithm encounters when a flight is regulated in several sectors. A saturated capacity plateau can be seen, and increasing the traffic volume enlarges the plateau. Moreover, it is important to recall that CASA regulates the traffic by postponing flights. A drawback of this approach can be seen in the last blue column in Figure 4(d): many flights are delayed between 9 p.m. and 10 p.m., leading to an entering flow of 40 flights, which is 5 flights over the declared capacity of 35 flights per hour.

### 4.2 Impact on the number of conflicts

In addition to the effects on the flow distribution, the regulation has an impact on the conflicts. Figure 5 displays, for each traffic volume previously described, the total number of conflicts per day, along with the number of conflicts per day for different sectors, with and without CASA. The sectors represent different types of flow density: two dense sectors, three average sectors, and two sparse sectors.

Surprisingly, Figure 5(a) shows that the removal of the regulation does not imply a greater number of conflicts until a traffic volume of +20%. Beyond this approximate threshold, the number of conflicts without CASA increases faster than the number with CASA, leading to a 15% difference for a +50% traffic volume. This observation at the global scale can be paired with an observation at the sector level. The evolution of the number of conflicts with increasing traffic depends on the type of sector, as highlighted by Figures 5(b)

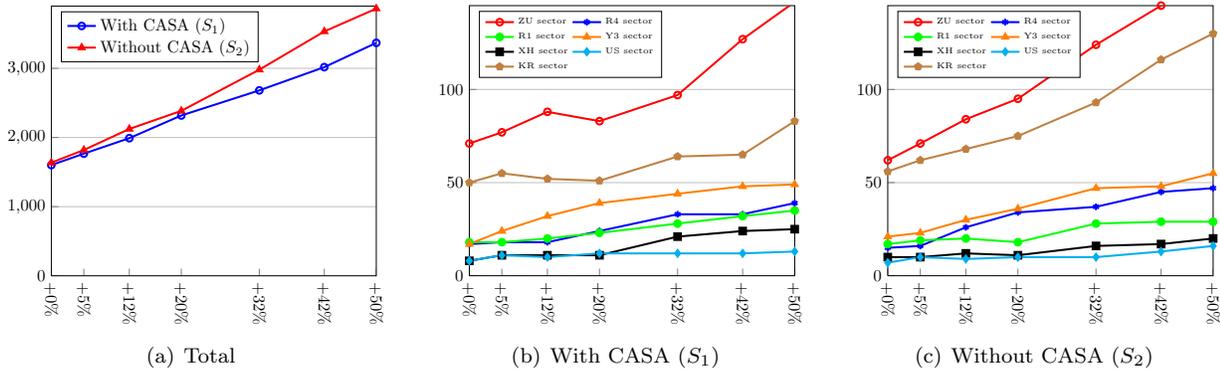


Figure 5: Comparison of the number of conflicts observed with and without CASA.

and 5(c). For the sparse and average sectors, the number of conflicts is similar whether or not CASA is applied. This observation suggests that the regulation has little effect on these sectors, except that it slightly reduces the minimum and maximum number of conflicts per day. Indeed, for low traffic densities, the nominal capacities are seldom saturated, so CASA has no effect on the flow distribution. On the other hand, for high-density sectors, the margin by which the number of conflicts without CASA exceeds the number with CASA grows with the traffic increase. This is because the nominal capacities are more saturated for high traffic densities. Thus, one of the regulation’s main benefits can be highlighted: to prevent overcapacity in different sectors, CASA smoothes the flow, spreading the number of conflicts over the day, as shown in Figure 6. This also reduces the workload of the controllers, especially in monitoring and communications.

### 4.3 Cost analysis

The regulation delay and conflict-resolution costs are important aggregate indicators of the overall traffic complexity. These costs are computed as described in Section 3.4 and are displayed in Figures 7(a) and 7(b) for scenarios  $S_1$  and  $S_2$ . Clearly, there is no regulation cost in  $S_2$ .

Figure 7(a) suggests that the global costs resulting from the regulation algorithm vary exponentially with the traffic volume. This is a logical trend considering that the intensification of the traffic mainly affects the congested areas during peak periods. Moreover, the plateau effect highlighted in Figure 4 shows that the peak periods tend to be flattened and widened, which leads to larger and more expensive delays. This indicates that significant savings could be made by improving the regulation procedure, and it also emphasizes that this improvement is necessary to handle larger traffic volumes.

The expected disadvantage of suppressing the ground-holding regulations is that it would result in extra conflict-resolution costs. Without regulation, a larger traffic flow must be handled, which increases the number of conflicts and the resolution maneuvers issued in response. Figure 7(b) shows the deconfliction costs for scenarios  $S_1$  and  $S_2$ . These global costs are the sum of the costs of the different types of maneuvers described in Section 3.4. Of these maneuvers, speed changes, which are seldom performed and relatively cheap, represent around 1% of the total cost. The remaining costs are equally divided between heading changes and altitude changes, which are more numerous and more expensive. The total costs are similar until the +32% traffic volume, where the conflict-resolution costs increase faster in  $S_2$  than in  $S_1$ . This results in 15% larger costs in  $S_2$  for a traffic volume of +50%. Although this is an important increase, the conflict-resolution costs are much than the regulation-related costs: around €250 000 for conflict resolution versus €32 000 000 for ground-holding regulation. Thus, the extra costs necessary to handle the traffic are negligible compared to the potential savings made by removing the ground-holding policies.

### 4.4 Impact on the number of maneuvers

Section 4.3 shows that removing the ground-holding regulations induces small additional costs for ATC compared to the potential savings in regulation, but the impact on the number of maneuvers is major.

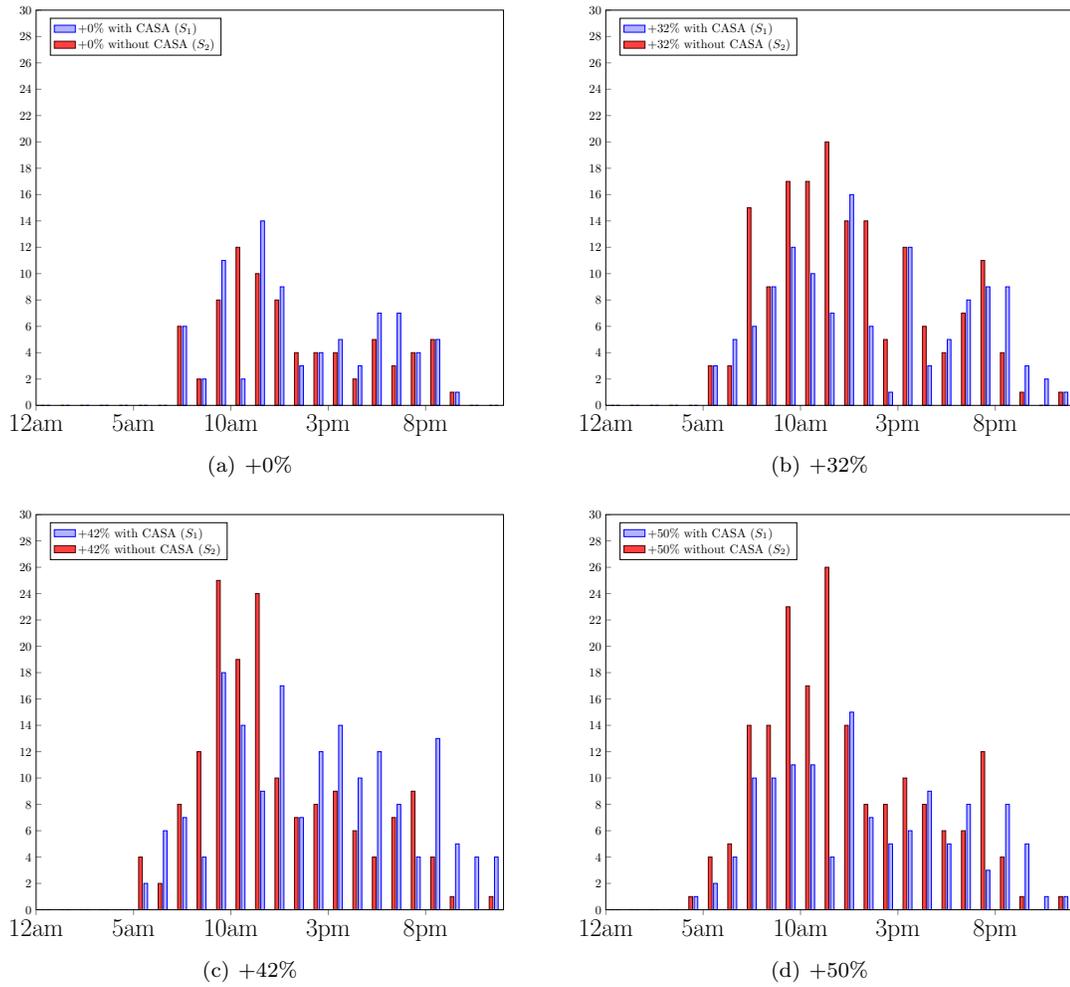


Figure 6: Number of conflicts per hour in KR for different traffic volumes.

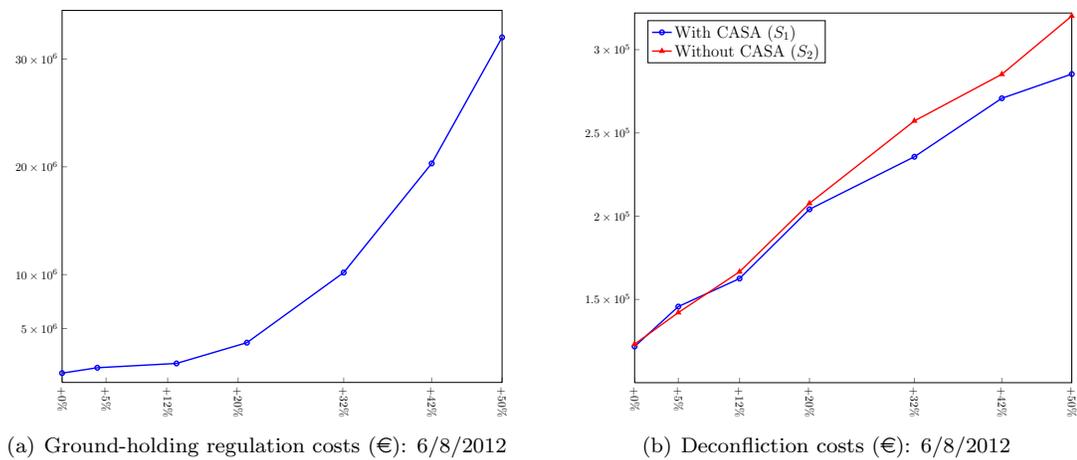


Figure 7: Ground-holding and ATC costs for 6/8/2012.

Indeed, as shown in Figure 8, the number of maneuvers issued per hour in dense areas becomes much higher than the current value: up to 26 maneuvers are performed within one hour for a traffic volume of +50%, which represents approximately one command every 2.5 minutes. This corresponds to a considerable workload in addition to the monitoring workload, making the controllers' task even more intensive.

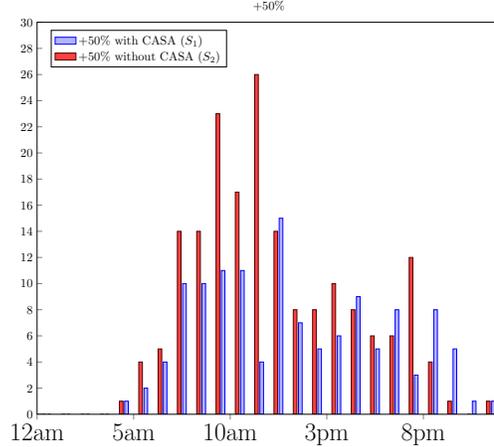


Figure 8: Maneuvers per hour for +50% traffic volume in KR sector.

## 5 Finding a compromise between costs and workload

### 5.1 Motivation

The previous section presented a traffic and cost analysis for scenarios  $S_1$  and  $S_2$ , which correspond to two extreme situations. The results show that retaining the current sector capacities induces an exponential growth in the ground-holding regulation costs. However, suppressing the regulation leads to a large increase in the controller workload that is unrealistic with today's tools. It therefore seems worth investigating a scenario that offers a compromise between regulation costs and controller workload.

### 5.2 Design of the scenario

Figure 7(a) indicates that the ground-holding regulation costs grow exponentially with the traffic volume. The function linking these quantities can be described by a sequence of positive slopes denoted  $(s_i)_{i=1,\dots,6}$ , with each slope indicating the magnitude of the increase in the delay costs between two consecutive traffic volumes. In other words, a steep slope emphasizes that retaining the current capacities between two traffic volumes leads to a large increase in the regulation costs.

Scenario  $S_3$  represents a trade-off situation where the growth in the regulation costs is controlled with an increase in the sector capacity. Figure 7(a) is used to determine the average slope  $s^*$  for the next five years; this represents an indicator for short-term trends in the cost increase. This value is used as a ceiling growth rate for the future traffic, hence yielding a bounded increase in the regulation costs. To enforce this constraint, we determine the new capacity values for each traffic increase iteratively via Algorithm 1. Basically, the algorithm increases the sector capacities until the rate of the cost increase drops below  $s^*$ .

Applying Algorithm 1 leads to the capacity-increase percentages listed in Table 5. The sector capacities are obtained by rounding down to the nearest integer. These new capacity values represent an interesting indicator for future objectives in terms of continuous improvement of ATC with a fixed growth rate in ATFM costs.

Since the new sector capacities are determined iteratively, it is interesting to plot the regulation costs computed at each step of the algorithm; see Figure 9.

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**Algorithm 1** Determining sector capacities for traffic volume increased by  $\alpha\%$ .

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```

1:  $\mathcal{C}$ : set of current sector capacities
2:  $D$ : cost of delays due to the ground-holding regulations for the current traffic
3:  $\mathcal{C}_\alpha$ : set of sector capacities for a traffic volume increased by  $\alpha\%$ 
4:  $R_\alpha$ : cost of delays due to the ground-holding regulations for a traffic volume increased by  $\alpha\%$ 
5:  $\mathcal{C}_\alpha \leftarrow \mathcal{C}$ 
6: while  $\frac{R_\alpha - D}{\alpha} > s^*$  do
7:   for  $c \in \mathcal{C}_\alpha$  do
8:      $c \leftarrow c + \frac{1}{100}c$ 
9:   end for
10: end while

```

---

Table 5: Increased capacities for scenario  $S_3$ .

Traffic volume	Capacity increase
+5%	+4%
+12%	+5%
+20%	+8%
+32%	+16%
+42%	+24%
+50%	+32%

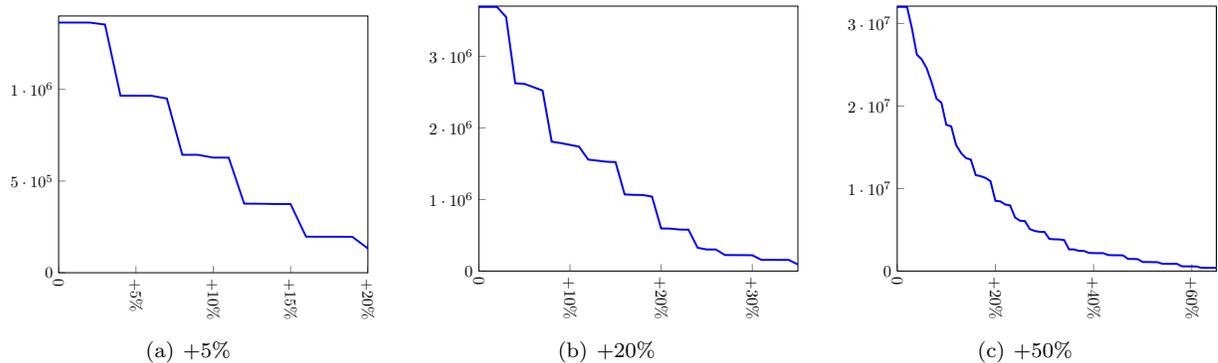


Figure 9: Ground-holding costs for increasing capacities.

Figure 9 shows that the regulation costs are a decreasing step function of the increase in capacity. The increased capacities can be gathered into clusters corresponding to a given value for the regulation costs. Two consecutive steps are separated by a gap, indicating a large difference in the regulation costs between two sets differing by only 1% in capacities. For instance, for a +20% traffic volume, €700000 could be saved daily by increasing the sector capacities by 7% instead of 6%. This difference can be explained by observing the distribution of the magnitude of the delays assigned by CASA. Some capacity values, especially for dense sectors, can trigger a bottleneck effect on the traffic flow, inducing long and costly delays. This observation is supported by the expanding plateau effect seen in Figure 4, where the flights are more and more delayed during peak periods. It is therefore possible to identify threshold capacity values that are critical with respect to the issued delays. Moreover, the shape of the curves indicates that one can expect stepwise improvements in the regulation costs.

### 5.3 Cost analysis

Figure 10 shows the ground-holding and conflict-resolution costs for the three scenarios. The results for the ground-holding costs suggest an almost linear growth for  $S_3$ , as imposed by the constraints of Algorithm 1, hence indicating considerable potential savings. The results provide evidence that  $S_3$  represents a compromise situation for ATC. It appears that  $S_3$  is closer to  $S_2$  than to  $S_1$  for high traffic volumes. This is because the constraint on the controlled delay costs imposed in the design of  $S_3$  is strict. More precisely, since the maximum increase rate allowed in the delay costs in  $S_3$  is small compared to the natural rate, the constraint is closer to  $S_2$  than  $S_1$  for high traffic volumes.

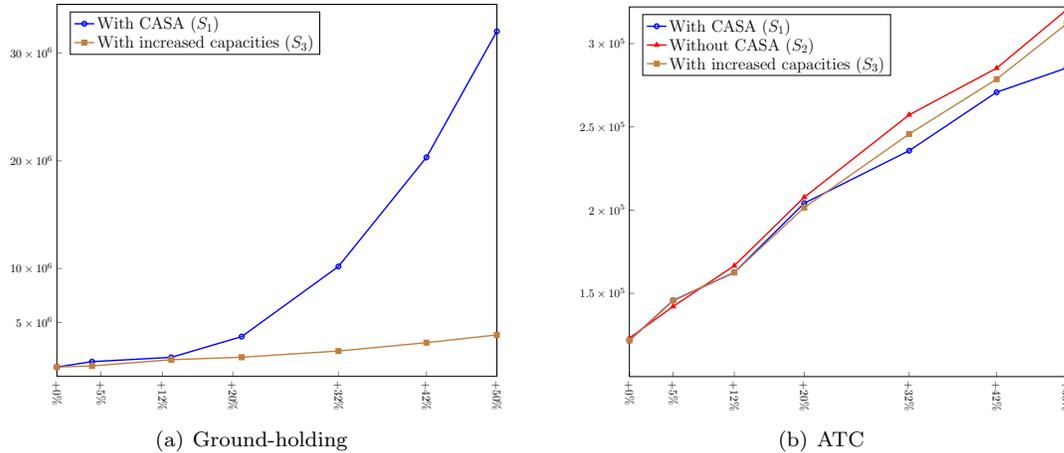


Figure 10: Ground-holding and ATC costs for the three scenarios on 08/06/2012.

### 5.4 Workload analysis

To evaluate how  $S_3$  compares to  $S_1$  and  $S_2$  in terms of the workload, we use the metric  $OC(\cdot)$  defined in Section 3.5. Figure 11 shows  $OC(KR)$  for the traffic simulated under the different scenarios. More precisely,

- the blue curve with circles shows  $OC(KR)$  for  $S_1$  with nominal capacities;
- the red curve with triangles shows  $OC(KR)$  for  $S_2$  with nominal capacities;
- the brown curve with squares shows  $OC(KR)$  for  $S_3$  with increased capacities;
- the green curve with pentagons will be described later, for the sake of clarity.

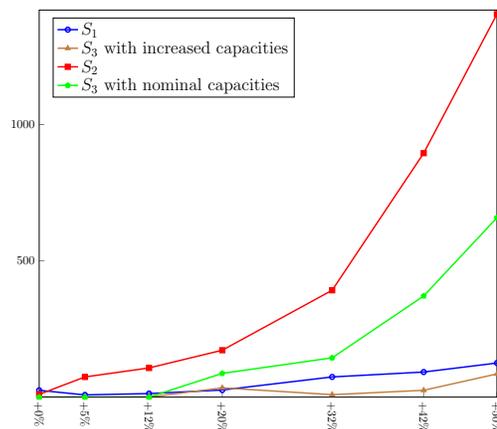


Figure 11:  $OC(KR)$  for different traffic volumes and regulation scenarios.

Figure 11 shows that  $OC(KR)$  grows exponentially for  $S_2$  whereas it increases slowly for  $S_1$ . This observation corroborates our observations in Section 4.1: localized high peaks appear in the entering flow distribution for  $S_2$ , whereas broader but smaller overcapacity plateaus emerge for  $S_1$ . Moreover, the values of  $OC(KR)$  for  $S_3$  with increased capacities and for  $S_1$  are similar. This indicates that CASA allows the effort required in communications because of capacity overrun to be stable with the increase in capacity. Given this information, we introduce the green curve with pentagons as  $OC(KR)$  for  $S_3$  but with nominal rather than increased sector capacities.  $S_3$  appears to be a compromise scenario for  $OC$ . The curve tends to grow exponentially, but with a much gentler slope than that of  $S_2$ , indicating that the traffic simulated with  $S_3$  would require less monitoring and management by the controllers.

The differences between the three scenarios in terms the number of resolution maneuvers are shown in Figure 12. The maximum number of conflict resolution maneuvers computed by the solver in sector KR is reduced from 27 to 20 during the busiest hour, leading to a less challenging situation. The number of maneuvers can be greater for  $S_3$  than for  $S_2$  for several hours after the high peak of  $S_2$ . This can be explained by the ground-holding regulation that is applied for  $S_3$ : the flights are delayed after the busy peak period, which leads to a greater flow entering the sector and more numerous conflict situations. However, this does not represent an unmanageable task for the controller. Indeed, the high peaks for the conflict-resolution maneuvers are the main challenge for the controllers. Therefore,  $S_3$  represents a situation with a relatively high workload but where the peaks are more manageable than in  $S_2$ .

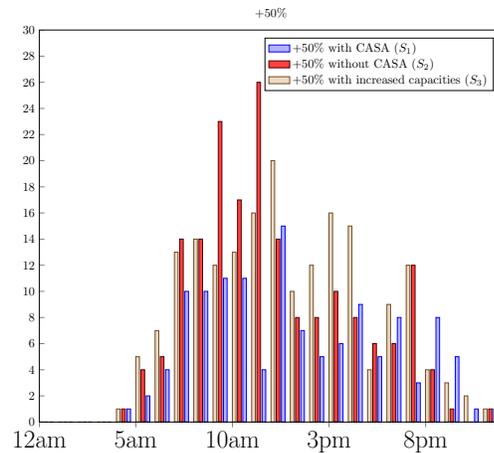


Figure 12: Maneuvers per hour for a +50% traffic volume in KR sector for the three scenarios.

## 5.5 Summary

The results presented here show that  $S_3$  is a satisfying alternative to  $S_1$  and  $S_2$ . The ground-holding costs increase reasonably with the traffic volume, while the expected controller workload remains manageable. Moreover, the cost analysis provides insights into possible future ATM network-design objectives: the capacities should find a trade-off between the costs and the workload. The sensitivity of the ground-holding costs to the sector capacity suggests that the regulations should be more robust to capacity variations in terms of the costs incurred.

## 6 Study of direct routes

The aircraft currently follow a constrained flight plan over a predefined route in a network, whereas direct routes could yield worthwhile savings. As mentioned in Section 2.4, there is no ground-holding regulation when direct routes are considered. Therefore, we compare the current traffic with direct traffic only for  $S_2$ .

## 6.1 Differences in the entering flow

A first metric for the comparison is the aircraft flow in dense areas. Figure 13 shows the entering flows in the KR sector for both types of routes. The flight distribution during the day is similar. There is a noticeable difference in the peaks, which are between 5% and 10% higher for direct routes. The current flight plans can be designed to avoid loaded sectors where a time regulation is more likely to be issued. However, these detours are not considered by the solver that we used. Therefore, with a regulation such as CASA, we would need more time regulations to enforce the capacity constraint.

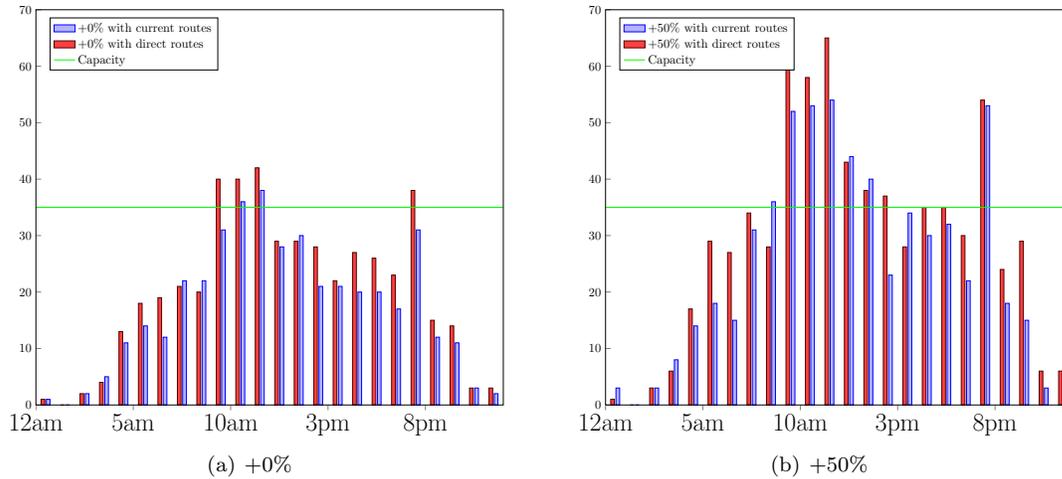


Figure 13: Comparison of the entering flow per hour for different traffic volumes in KR sector for current routes and direct routes.

## 6.2 Differences in the number of conflicts

Another interesting metric to investigate is the number of conflicts. Figure 14 displays a comparison of the total number of conflicts during a single day for the two types of routes. There are between 20% and 27% fewer conflicts for direct routes. This difference can be explained by the underlying network structure of the current routes: the traffic must follow predefined routes, which leads to high traffic densities and more conflicts.

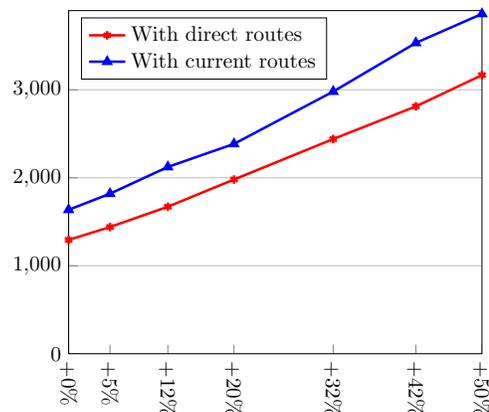


Figure 14: Total number of conflicts for 06/08/2012.

The number of conflicts is higher for the current routes, but their location in the network is known beforehand. The controllers know where conflicts are likely. Moreover, their geometry makes them simpler to

solve, since they usually involve aircraft following paths that cross at a significant angle, and the continuous improvement performed by ATM eases the controller's tasks. For direct routes, conflicts can be difficult to handle, since many of them involve situations of pursuit. A situation of pursuit occurs when two or more aircraft follow the same route or close parallel routes. The crossing angle is close to  $0^\circ$ , and these conflicts require maneuvers that last longer as well as additional post-maneuver monitoring. Because they last longer, they create difficulties for solvers using a rolling-horizon loop, which is the case for the solver we use.

### 6.3 Differences in the number of ATC maneuvers

The conflict-resolution maneuvers issued per hour for the KR sector are shown in Figure 15.

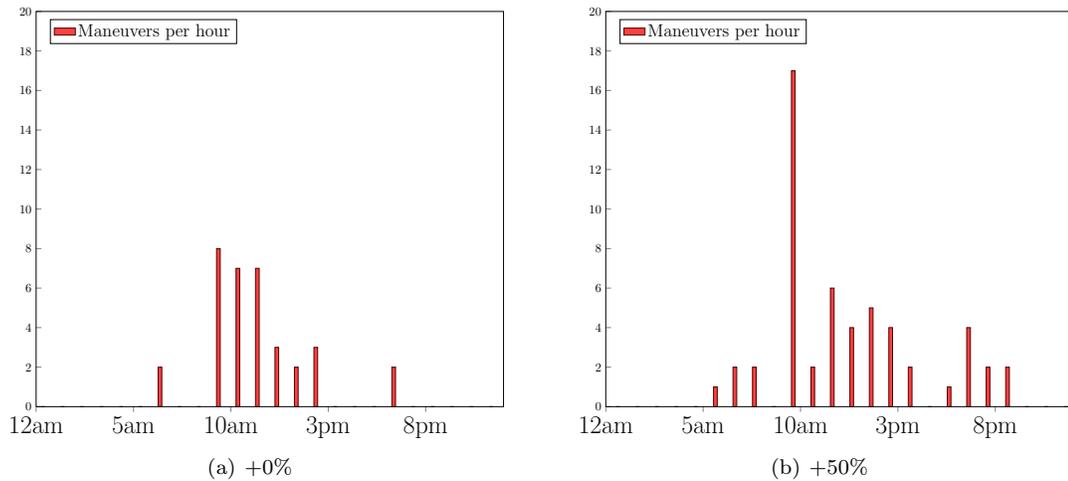


Figure 15: Conflict-resolution maneuvers per hour for different traffic volumes in KR sector for direct routes.

We showed in Section 6.1 that the two route types have similar flow distributions; however, the differences in workload are significant. The maximum number of conflicts per hour is smaller for the direct routes, and the difference in magnitude between consecutive hours can be greater. For instance, in Figure 15(b) no conflicts occur between 9 a.m. and 10 a.m. whereas 17 occur between 10 a.m. and 11 a.m. Such large differences lead to a heterogeneous workload for the controllers. This indicates that companies use spatial restrictions to avoid congested areas, hence reducing the likelihood of major delays. Direct routing needs space-related regulation more than it needs time-related regulation. The former would reduce the flights in congested areas and avoid large ground-holding delays.

### 6.4 Cost analysis

Simulations without conflict resolution allow us to focus on the differences between the two route types. The results of the traffic simulation highlight potential savings in fuel consumption, flight time, and traveled distance; see Table 6.

Table 6: Improvement achieved by using direct routes rather than current routes.

Improvement when using direct routes (%)		
Flight time	Fuel consumption	Distance traveled
9.8%	7.6%	9.3%

Figure 16 compares the costs of the avoidance maneuvers for the two route types. The growth rate is smaller for direct routes; it tends to slow from volumes greater than +30%. The cost difference for the two route types increases to a 40% difference for a volume of +50%. This cost is linked to the number of

maneuvers rather than the complexity of the conflicts. This statement is corroborated by the difficulties of the conflict resolution observed with our solver.

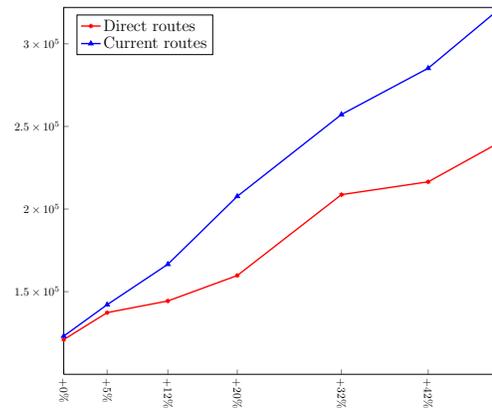


Figure 16: ATC costs for current and direct routes without ground-holding regulations: 08/06/2012.

## 6.5 Summary

The discussion in this section has shown that direct routes are crucial for the future, because they could yield cost savings of 10%, by giving companies more flexibility in trajectory design. We have also shown that direct routes have fewer conflicts, reducing the ATC costs. However, the conflicts can be complex, so we need regulation and conflict-resolution procedures that are appropriate for direct routes. Furthermore, the difficulties of conflict resolution for direct routes are linked to the solver used, and we consider this information to be a valid indicator of the traffic complexity.

## 7 Conclusion

We have analyzed the interactions between two layers of the ATM, to evaluate the impacts of the current ground-holding regulation scheme on the delay costs, sector loads, and conflict-resolution costs. We used a traffic simulator with modules to compute the regulation delays, to simulate the trajectories, and to resolve the conflicts. We chose French traffic data for a particularly busy day in 2012 as the input for the simulator, and we developed a traffic increase procedure to generate meaningful predictions to 2035.

The tests focus on two scenarios: the current regulation procedure and no regulation. We compare these scenarios using a set of metrics related to the costs incurred and the controller workload. Of those measures, the entering flow per hour and the number of conflicts highlight the effect of regulation on the traffic. As expected, for a busy sector, regulation reduces the amplitude of the peaks and spreads the entering flow over the day. However, the impact on the total number of conflicts is less important than expected: the improvement is noticeable only for a traffic increased by 30%.

We estimate that for a traffic increase of 50%, the delay costs will amount to millions of euros if the current regulation procedure is not changed. The additional conflict-resolution effort required without regulation will raise the associated cost by 15%, but this amount is negligible in comparison to the delay costs. There is a small extra cost for the fuel consumption. More important, the workload resulting from the new distribution of conflicts will be unmanageable for controllers working in the current framework. In addition to monitoring dense areas, they would have to issue a maneuver instruction almost every two minutes in some congested areas.

We then described a third scenario where the capacities are determined to satisfy a criterion limiting the growth in the ground-holding delay costs. The results lead to a worthwhile compromise: the delay costs increase gently and the controller workload is reduced compared to the no-regulation scenario. This scenario

also allows new capacity values to be determined, hence setting clear objectives for future research on ATM network management.

We have shown that significant savings could be achieved by developing a regulation algorithm that is better adapted to dense traffic. Our simulations have highlighted the sensitivity of the delay costs to the sector capacities: small capacity variations yield substantial savings. This observation indicates that a new regulation procedure should be robust to capacity changes. Such a procedure would certainly benefit from the introduction of automated tools for the monitoring, communication, and conflict detection and resolution. Such tools would allow for the successful management of much more complex situations without increasing the workload. Efficient tools could generate massive indirect savings if an adapted regulation procedure were simultaneously implemented. Finally, we have developed a complete framework for evaluating automated tools for air conflict resolution, which will enable us to test models developed in the future. We can study their performance independently or jointly under various scenarios.

We also studied direct routing. The traffic volumes already created were converted into direct routes. Since the notion of an air sector is irrelevant, there was no ground-holding regulation, and we used the traffic indicators listed above to compare direct traffic with the current traffic without regulation. Direct routes lead to a heterogenous workload; companies use spatial restrictions to avoid congested areas, hence reducing the likelihood of major delays. This suggests that a regulation procedure for direct traffic should include both space regulation and time regulation. Direct routes have fewer conflicts, but the geometry of these conflicts is more complex, with the majority being pursuits. These proved to be difficult for our solver, leading us to consider this a valuable indicator of traffic complexity.

Future work could develop more sophisticated traffic-increase procedures, based on more detailed local forecasts extracted from the STATFOR reports [2]. This would lead to a geographically heterogenous increase in the traffic, which is more realistic. It would also be interesting to compare several conflict solvers, and in particular their performance on direct routes. Different regulation procedures that include realistic predictions for the sector capacities should also be considered, keeping in mind that the interaction of regulation procedures and conflict-resolution algorithms should be optimized. Future work could also explore traffic scenarios that include the ability of companies to adapt their schedule according to the regulations applied; this would give more meaningful simulation results. Indeed, whatever the future ATM framework, companies will adapt their schedule to avoid unnecessary delays.

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