AN HEURISTIC APPROACH FOR LARGE SCALE CREW SCHEDULING PROBLEMS AT RIO-SUL AIRLINES

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Abstract – The airline crew scheduling problem entails the assignment of planned rotations to the airline crew members. This paper presents a real research conducted in Rio-Sul Airlines to solve real schedules. An heuristic approach is presented using the Bin-Packing problem solving techniques, guided by mathematical models which consists in two procedures: the first one tries to guarantee that all the planned assignments are done, always obeying the federal and crew member regulations; a second step carries out successive improvements of the original schedule, in order to reach a fair duty distribution. Schedules obtained and computational results are also presented.

Keywords: Crew Scheduling, Bin-Packing, Heuristic, Integer Programming

1.0 - INTRODUCTION

Crew costs in air transportation are extremely high, amounting up to 20% of total airlines operation costs. Therefore, airlines consider that efficient management of their crew staff is a question of highest economic relevance. Unfortunately, the numerical solutions of the associated large scale and combinatorial optimization problems are very difficult to obtain.

Following the development of Computer Science, many optimization approaches have been proposed to solve this problem: first mathematical programming methods (Mixed Linear and Integer Programming) and more recently artificial intelligence methods (logical programming, constraint programming) as well heuristic approaches and their respective combinations.

Several approaches for the crew scheduling problem have been presented in the literature. Important heuristics include simulated annealing [4] [8] and genetic algorithms [7]. Exact approaches include tree search, dynamic programming, column generation and branch and cut [2], [3], [5], [6]. A new formulation and its decomposition algorithm is presented in [10]. An interesting article that describes the crew scheduling problem is showed in [9].

This paper will describe an hybrid approach, using heuristic procedures combined to mathematical programming in different steps of the process, to solve real crew scheduling problems in Rio-Sul Airlines. The method apply sequential heuristics in which the general problem is decomposed and then solved by a mathematical model for each subset of crew members, reducing the combinatorial size of the entire problem.

The paper is organized as follows. Section 2 describes the problem of assigning pairings to crew members; section 3 presents a new mathematical model representing the problem; section 4 proposes an heuristic approach to solve large schedules. Computational results are presented in section 5 and some conclusions are presented in the last section.

2.0 – PROBLEM DESCRIPTION

The airline crew scheduling problem asks to assign crews to flights so as to serve all the operated flights and minimize crew costs. The problem is characterized by an overall objective function, which is composed of a couple of conflicting objectives as well by a set of complex constraints imposed by federal aviation regulations, union work rules, company polices, crew's working conditions and payment.

Traditionally, the crew scheduling problem is solved in a two steps process. At first, flights are grouped into duties (or rotations) named "pairings", and then those pairings must be assigned to the company available crew. In that way, some of the related constraints are guaranteed by generating pairings and some others must be considered at the assignment moment. Here are some of the most important Brazilian Aviation Regulations:

2.1 Aviation Regulation guaranteed during Pairing Generation

No crew member may fly more than 9 ½ hours per day; The total work of a duty day cannot be higher than 12 hours; Between two duty days must be assigned a rest period of 12 hours; Each crew member must return to base in a maximum of 6 days ; No crew member may land more than 5 times during one day; Changing aircrafts must obey a fixed time established by each airport.

2.2 - Aviation Regulation guaranteed during Crew Scheduling

For all crew members must be assigned at least 6 days-off and 1 weekend day-off (48 hours, that must contain fully 24 hours on a Saturday or Sunday) No crew member will work continuously more than 6 periods of 24 hours without receiving a day-off or a weekend day-off;

No crew member may be assigned to more than 2 alert duties on a week; No crew member may be assigned to more than 8 alert duties on a month; 2.3 – Quality Criterias guaranteed during Crew Scheduling

The total kilometers to be flown must be distributed equally, in order to balance salary earnings;

The total time flown must be distributed equally, such as combined to balanced kilometers flown, can propitiate equal time of daily, night and weekend works;

A crew member might not be assigned to a day-off immediately after an alert duty day (this may cause problems in scheduling execution, if the crew member is set in motion during an alert time for a duty with more than one day);

There must be assigned to all crew members at least one flight rotation every week;

Previous solicitations by the crew members asking for days-off or rotations in specific dates, must be tried to be assigned preferentially;

3.0 – The Assignment Model

The problem consists to assign planned rotations and days-off to available crew members. So consider the set of crew members I and the set of all tasks J. The decision of assigning a task $j \in J$ to a crew member $i \in I$ is represented by x_{ij} , which can assumes value 1 if this assignment is done and value 0 otherwise. The main goal is to find a solution in which crew members, kilometers and time to be flown will be balanced.

Consider still the family set $\Omega = \{J_1 \cup J_2 \cup \cdots \cup J_k\}$, $\Omega \subseteq J$, where each J_s , $1 \le s \le k$, is a subset of the set of all tasks J, i.e., $J_s \subseteq J$, and all the tasks in J_s overlapping in time. There is another family set $\Psi = \{F_1 \cup F_2 \cup \cdots \cup F_w\}$, $\Psi \subset J$, where each F_r , $1 \le r \le w$, consists a set of possible days-off that can occurs between D_{\min}^r and D_{\max}^r . The limits D_{\min}^r and D_{\max}^r define a time-window in which a crew member must receive one day-off. Each planned rotation requires a exact number of crew members, defined by n_j and have its length in kilometers expressed by m_j .

$\int Maximize \alpha z + \beta$	3t	
SubjectTo		
$\sum_{i \in I} x_{ij} = n_j$, $\forall j \in J$	(1)
$\sum_{j \in J_s \subset \Omega} x_{ij} \leq 1$, \forall s, $1 \le s \le k$, $\forall i \in I$	(2)
$\sum_{j \in F_r \subset F} x_{ij} \ge 1$, $\forall r, l \leq r \leq w, \forall i \in I$	(3)
$\sum_{j \in F} x_{ij} \ge 8$	$, \forall i \in I$	(4)
$z \leq \sum_{j \in J} m_j x_{ij}$, $\forall i \in I$	(5)
$t \leq \sum_{j \in J} h_j x_{ij}$, $\forall i \in I$	(6)
$x_{ij} \in \{0,1\}$	$, \forall i \in I, \forall j \in J$	
$z \ge 0, t \ge 0$		

The problem formulation is described as follows:

The first constraint set expresses that each pairing must be covered exactly the desired number of times; the second constraint set represents the set of overlapping pairings in time that have to be assigned to different crew members. These relations can be found by searching in conflict graphs [1]; the third set of constraints is composed by time-windows that requires that each crew member will be assigned at least one day-off. Doing so, no crew member will work more than 6 days consecutively without receiving a day-off; the forth set of constraints ensure that all crew members receive at least 8 days-off.

The fifth set of constraints ensure that the variable maximized at the objective function will be less or equal the sum of kilometers flown by each crew member and the sixth constraint has the same behavior as the fifth, regarding to the time flown. In order to present a more generic model, only the major constraints of the problem were showed above.

The multi-objective function has two terms. A max-min function that increases the minimum time and kilometers flown by each crew member, pushing them together to the average values. In company regulation, rotations that happen on Sundays and during a certain period of the night (06:00 pm to 06:00 am), and its combinations, have different weights during payment calculation. When time and kilometers flown are balanced together, the system is doing more than balance crew earnings. In fact, balances the time worked on Sundays and during nights indirectly. In order to preserve the magnitude of values from kilometers and seconds, two constants $\alpha \ge 0$ and $\beta \ge 0$ are previously calculated, and they are based on the values of kilometers and seconds average from each problem considered.

This mathematical model was used and it was solved in reasonable time for small bases, involving up to 20.000 binary variables. However, there were problems

higher than those ones, involving more than 700.000 binary variables (360 crew members to be assigned to 2000 rotations), which have demanded for further researches in order to establish other procedures to solve them.

4.0 – THE HEURISTIC APPROACH

Because most scheduling problems are large, it is difficult reach the global optimal solution. Most existing methods apply sequential heuristics in which the general problem is decomposed into several smaller ones that consider far fewer alternatives and can therefore be solved optimally.

Each method for decomposing the global problem has its own disadvantages. Schedules constructed pilot by pilot are not often uniform quality. The day-by-day method cannot take account of problems that may arise when scheduling for later days [11].

4.1 – Avoiding uncovered rotations

In this heuristic approach, the pilot-by-pilot decomposing was chosen to be performed. The technique used is similar to those related to the bin-packing problem and the pairing distribution is conducted trying to guarantee that the maximum set of tasks can be assigned.

The bin packing problem (BPP) is a well-known NP-hard grouping problem: items of various sizes have to be grouped inside bins of fixed capacity. Actually, the propose of initial assignment it's only similar to the BPP, because in the classical version, the objective is to minimize the number of bins used. In this assignment step, the bins (crew members) do not have the same capacity, and all of them must receive working duties. Because schedules are very tight, the main problem is to avoid uncovered pairings at the end of the process. The allocation pilot by pilot chooses a crew member (bin) and then uses a mathematical model to assign the most quantity of duty to him at each step.

In this matter, there are two main selection strategies: the first one is to select the convenient crew member to be assigned and the second one is to select the set of pairings to have the precedence to the current assignment phase.

The first strategy is natural, and crew members are chosen beginning with the ones who have more time of blocked days to the total schedule. It is easy to understand that those who have more impediments to receive the pairings have to be treated first. The algorithm let those who has the total time available to work to be the last ones.

A mathematical model controls the second strategy of selection. The objective function is composed by two terms: the duration of the pairing and by the evaluation of how critic is the task for the entire schedule. The first term is intuitive, once pairings longer in time duration (like larger objects) are more difficult to be assigned in the final steps. The second term of the function is obtained by a global analysis of the schedule and it is done as shown:

If we can imagine a line of time that goes through all the days of the related schedule, we would observe that there are moments in time that have more tasks

occurring at the same time than others. Those peaks and valleys determine the critic value of each task and can be formally described as:

Definition. Each planned rotation $j \in J$ has a critical value $v_j = \underset{1 \le s \le k}{Max}\{|J_s| | j \in J_s\}$. It corresponds to the maximum overlapping in time with others planned rotations.

Each planned rotation has its duration in minutes expressed by d_j , and the maximum length in kilometers is denoted by D, i.e., $D = \underset{j \in J}{Max}\{d_j\}$. The model used to conduct this first step is:

$$\begin{aligned} Maximize & \sum_{i \in I} \sum_{j \in J} (Dv_j + d_j) x_{ij} \\ SubjectTo \\ & \sum_{i \in I} x_{ij} \leq n_j , \forall j \in J \\ & \sum_{i \in J_s \subset \Omega} x_{ij} \leq 1 , \forall s, 1 \leq s \leq k, \forall i \in I \\ & \sum_{j \in J_s \subset \Omega} x_{ij} \geq 1 , \forall r, 1 \leq r \leq w, \forall i \in I \\ & \sum_{j \in F_r \subset F} x_{ij} \geq 8 , \forall i \in I \\ & x_{ij} \in \{0,1\} , \forall i \in I, \forall j \in J \end{aligned}$$

$$\begin{aligned} & (1) \\ & (1) \\ & (1) \\ & (1) \\ & (1) \\ & (2) \\ & (2) \\ & (1) \\ & (1) \\ & (2) \\ & (2) \\ & (1) \\ & (1) \\ & (2) \\ & (2) \\ & (1) \\ & (1) \\ & (1) \\ & (2) \\ & (2) \\ & (2) \\ & (3) \\ & (4) \\ & (4) \end{aligned}$$

4.2 – Searching for a Balanced Distribution

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Unfortunately this approach produces a final unbalanced distribution. The crew members selected at the beginning of the process receives the maximum of possible time duty and the last ones receives less work, even no rotations can be assigned to them.

In order to get a balanced scheduling, some crew members are selected each time to promote a redistribution of tasks among them. This is reached by the use of the model that is presented in section 3. The success of this heuristic approach depends on the number and the characteristics of the crew members selected at each step. Here the model proposed is able to obtain the best redistribution among the crew members that had their previous scheduling deselected.

At each iteration of this procedure, the standard deviation of kilometers among all crew members is evaluated. If the goal is not reached yet, a certain number of crew member is selected and submitted to model. This procedure is repeated until the standard deviation of time and kilometers distribution or run time limit has been reached. During first iterations, due to great unbalanced distribution of kilometers among the crew members selected, the standard deviation decreases rapidly but this characteristic reduces as long as the number of iterations increase.

4.0 – Computational Results

The problem data consists of manually constructed rotations by Rio-Sul Airlines planners, and refers to real working schedules for pilots (PN1 and PN2) and flight attendants (PN 3) from three different bases. The first one is a small base for 8 pilots and 93 rotations; the second is a medium base for 70 pilots and 300 rotations; the last one is the largest problem referring to 350 flight attendants and 2000 rotations to all four fleets (E-120, B735, FK50, E145), from the largest base.

Table 1 contains the results for three test problems. The columns #Crew and #Parings give the number of crew members and pairings, respectively. The column dimension describes them showing the number of variables versus the number of constraints. For the problem PN1, the solver reached a sub-optimal solution in 3 hours (node 2296 at the branch-and-bound tree) and it did not increase the value of objective for the next 48 hours.

All mathematical models were solved in a microcomputer Pentium III, 500 MHz, with 128 MB of RAM using XPRESS-MP v. 11. The stopping condition was a coefficient of variation equal or less than 5% to relative distribution of kilometers and flying hours among all crew members.

					Heuristic	
PN	#Crew	#Pairings	Dimension	Exact ⁽¹⁾	Packing	Refinement
			(nvarXnconst)	(min)	Phase ⁽²⁾	Phase ⁽³⁾
			x1000		(min)	(min)
1	8	93	1,3 x 1,6	180	3	45
2	70	300	21 x 70	Not	40	360
				available		
3	350	2000	700 x 1000	Not	90	600
				available		

Table 1: Computational results

(1) Time spent to reach a sub-optimal solution corresponding to a gap of 4% from the bound of linear relaxation;

(2) Time spent to build a complete solution in the first phase of the heuristic process;

(3) Time spent to balance the kilometers and the seconds to be flown by each crew member with a coefficient of variation of 5% for both distributions.

In order to evaluate the performance of the proposed heuristic, a comparison was made between the exact and heuristic solutions found for the problem 1. The exact method built a schedule where the minimum total of kilometers flown was 45455 and the minimum total time flown was 63 hours and 43 minutes; heuristic solution reached the values 45890 and 63 hours and 43 minutes respectively. Applying the constants $\alpha = 0.51$ and $\beta = 0.1$, the objective function for both methods were respectively 4553 and 4634. These objective function values show that the proposed heuristic procedure reached a better solution, which is closer to the bound of the

linear relaxation of the problem, with a gap less than 2% from optimal solution, while the exact approach stayed 4% distant from the same value, but for a suboptimal solution (the better solution found in 51 hours).



Coefficient of Variation Conjugated Convergence

Fig nr 1 – Coefficient of Variation Conjugated Convergence

The graphic above shows the convergence of both standard deviation (time and kilometers) flown for the successive refinements. For larger problems (PN2 and PN3) we can see the heuristic guiding the successive choices of pilots to have the tasks to be changed among themselves. Some iterations bring crew members who are far form the average considering the time flown, and some others considering the kilometers flown; the result is a zigzag behavior for the descending curve.

Total Coefficient Variation Convergence in Time



Fig nr 2 – Coefficient of Variation Convergence in Time

The graphic above shows the convergence of the objective function along the time. The smaller schedule (PN 1) presents a drastic decrease at the beginning of the process and then stays stable as the time goes on. The larger problems (PN2 and PN3) has a soft descend and can be understood as the result of the number of crew members selected to be refined at each step is very few regarded to the total of crew members that compose the entire schedule.

5.0 – Conclusions

The method described in this paper has been used to solve pilots and flight attendants' problems in Rio-Sul Airlines. The use of the hybrid approach that combines heuristics procedures with mathematical programming at the several steps of the process has generated good schedules in satisfactory time.

When schedules refers to small bases, the global optimality is reached by applying the model described in section 1 to all the crew members; for medium to large bases the constructive solution proposed has been used with great success.

As mentioned previously, the hybrid procedure proposed has reached solutions that are found to be within 10% off the bound of linear relaxation in small bases, where the two approaches (exact and heuristic) can be generated for both

methods for comparison. These results can be projected to larger schedules and the same behavior can be expected.

BIBLIOGRAPHY

- [1] Atamturk, A., Nemhauser, G. L. and Savelsbergh, M. *Conflict Graphs in Integer Programming*, Technical Report, School of Industrial and Systems Engineering, George Institute of Technology, 1998. Available from http://tli.isye.gatech.edu/ research/papers/files/TLI9803.pdf.
- [2] Beasley, J. & Cao, B. A tree search algorithm for the crew scheduling problem. *European Journal of Operational Research*, vol. 94, 1996, 517-526.
- [3] Beasley, J. & Cao, B. A dynamic programming based algorithm for the crew scheduling problem. *Computers & Operations Research*, vol. 25, 1998, 567-582.
- [4] Emden-Weinert T. and Proksch, M. *Best Practice Simulated Annealing for the Airline Crew Scheduling Problem*. Journal of Heuristics (**4**) 419-436, 1999.
- [5] Gamache, M., Soumis, F., Marquis, G. <u>A</u> Column Generation Approach for Large Scale Aircrew Rostering Problem. Unpublished Paper.
- [6] Hoffman, K.L. and Padberg, M. *Solving Airline Crew Scheduling Problems by Branch-and-Cut*. Management Science (**6**) 657-682, 1993.
- [7] Levine, D. *Application of a hybrid genetic algorithm to airline crew scheduling*. Computers & Operations Research (**23**) 547-558, 1996.
- [8] Lucic P., Teodorovic D. Simulated Annealing for the Multi-Objective Aircrew Rostering Problem. Technical Report, Faculty of Transport and Traffic Engineering. University of Belgrade. 1998.
- [9] Ryan, D.M. Optimization Earns its Wings. OR/MS TODAY (27) 26-30, 2000.
- [10] Vance, P.H., Barnhart C., Johnson, E.L. and Nemhauer, G. L. *Airline Crew Scheduling A new Formulation and Decomposition Algorithm*. Operations Research (**2**) 188-200, 1997.
- [11] Ryan, D. M. and Day, P. R., *Flight Attendant Rostering for Short-Haul Airline Operations*. Operations Research (**45**) 649-661, 1997.

APPENDIX 1 - THE GENERATED SCHEDULES

KILOMETER AVERAGE (ARITHMETIC MEAN):	46229
HOURS FLOWN AVERAGE (ARITHMETIC MEAN):	65:33

EXACT SCHEDULE

KILOMETERS STD DEVIATION:	874,7463
KILOMETERS COEFFICIENT OF VARIATION:	1,892177 %
SECONDS STD DEVIATION:	7535,364
SECONDS COEFFICIENT OF VARIATION :	3,19312 %

TASK	BEGIN	END	FLIGHT TIME	KM FLOWN
PILOT NR: 1				
50149134 50149135 50149199 DAY-OFF 50149139 50149172 DAY-OFF 50149207 50149207 50149212 DAY-OFF 50149212 DAY-OFF 50149183 DAY-OFF WEEK-OFF 50149157 50149190 DAY-OFF 50149225	10/01/99 19:30 10/02/99 19:30 10/04/99 07:00 10/05/99 16:00 10/06/99 19:30 10/08/99 08:30 10/12/99 07:00 10/13/99 08:30 10/15/99 16:00 10/17/99 07:00 10/18/99 08:30 10/21/99 16:00 10/22/99 16:00 10/22/99 16:00 10/22/99 19:30 10/26/99 08:30 10/28/99 13:37 10/30/99 07:00	10/02/99 16:07 10/03/99 16:07 10/05/99 08:00 10/06/99 16:00 10/07/99 16:07 10/11/99 13:37 10/11/99 13:37 10/13/99 08:00 10/15/99 13:37 10/16/99 16:00 10/19/99 08:00 10/21/99 16:00 10/22/99 16:00 10/22/99 16:00 10/25/99 16:07 10/28/99 13:37 10/29/99 13:37 10/29/99 13:37	05:13 05:13 0 05:13 11:42 0 0 11:42 0 0 11:42 0 0 0 11:42 0 0 0 0 5:13 11:42 0 0 0 0 5:13 11:42 0 0	3452 3452 1960 0 3452 5240 0 1960 5240 0 3640 0 5240 0 5240 0 5374 5240 0 1960
		TOTALS:	67:40	46210
PILOT NR: 2				
DAY-OFF 50149136 50149137 50149201 DAY-OFF 50149141 WEEK-OFF DAY-OFF 50149149 50149151 50149152 50149153 DAY-OFF 50149155 50149219 50149193	10/02/99 08:00 10/03/99 19:30 10/04/99 19:30 10/06/99 07:00 10/07/99 08:00 10/08/99 19:30 10/09/99 16:07 10/12/99 08:00 10/13/99 08:00 10/16/99 19:30 10/18/99 19:30 10/20/99 19:30 10/21/99 16:07 10/22/99 19:30 10/22/99 19:30 10/22/99 19:30 10/22/99 8:30	10/03/99 08:00 10/04/99 16:07 10/05/99 16:07 10/07/99 08:00 10/08/99 08:00 10/1999 16:07 10/11/99 16:07 10/13/99 08:00 10/14/99 08:00 10/17/99 16:07 10/20/99 16:07 10/22/99 16:07 10/23/99 16:07 10/23/99 16:07 10/23/99 16:07 10/23/99 16:07 10/23/99 16:07	0 05:13 05:13 0 0 05:13 0 0 0 0 0 0 0 0 0 0 0 5:13 0 0 5:13 0 0 5:13 0 0 5:13 0 0 5:13 0 11:42 0 11:42 0 5:08	0 5374 3452 1960 0 3452 0 0 3452 3452 3452 3452 3452 3452 3452 3452
PILOT NR: 3				
50149165	10/01/99 08:30	10/03/99 13:37	11:42	5240

DAY-OFF 50149169 50149203 DAY-OFF 50149143 50149208 DAY-OFF 50149148 50149148 50149148 50149148 50149148 DAY-OFF 50149156 DAY-OFF DAY-OFF 50149191 WEEK-OFF	10/03/99 16:00 10/05/99 08:30 10/08/99 07:00 10/10/99 16:00 10/10/99 19:30 10/13/99 7:00 10/14/99 16:00 10/15/99 19:30 10/20/99 07:00 10/21/99 08:00 10/23/99 19:30 10/25/99 08:00 10/25/99 08:00 10/27/99 08:30 10/27/99 08:30	10/04/99 16:00 10/07/99 13:37 10/09/99 08:00 10/10/99 16:00 10/11/99 16:07 10/14/99 8:00 10/14/99 16:07 10/16/99 16:07 10/19/99 13:37 10/21/99 08:00 10/22/99 08:00 10/27/99 08:00 10/27/99 08:00 10/27/99 08:00 10/29/99 13:37 10/21/99 16:00	0 11:42 0 05:13 0 05:13 11:42 0 0 05:13 0 05:13 0 11:42 0	0 5240 1960 0 5374 1960 0 3452 7869 1960 0 3452 0 0 3452 0 0 5240 0
50149164	10/31/99 19:30	11/01/99 16:07	05:13	5374
		TOTALS:	67:40	47121
PILOT NR: 4				
50149198 DAY-OFF 50149170 DAY-OFF 50149142 50149206 DAY-OFF 50149146 50149147 50149180 DAY-OFF 50149184 50149218 DAY-OFF 50149158 50149159 50149159 50149160 DAY-OFF WEEK-OFF	10/03/99 07:00 10/04/99 08:00 10/06/99 08:30 10/08/99 16:00 10/09/99 19:30 10/11/99 07:00 10/12/99 16:00 10/13/99 19:30 10/14/99 08:30 10/19/99 08:30 10/23/99 07:00 10/22/99 08:00 10/25/99 19:30 10/25/99 19:30 10/27/99 19:30 10/28/99 16:00	10/04/99 08:00 10/05/99 08:00 10/08/99 13:37 10/08/99 16:00 10/10/99 16:07 10/12/99 08:00 10/13/99 16:07 10/15/99 16:07 10/15/99 16:07 10/22/99 13:37 10/22/99 08:00 10/25/99 08:00 10/25/99 08:00 10/25/99 16:07 10/27/99 16:07 10/28/99 16:00 10/31/99 16:00	0 0 11:42 0 05:13 0 05:13 05:13 11:42 0 11:42 0 05:13 05:13 05:13 05:13 05:13 05:13 05:13 0 0 0 0 0 0 0 0 0 0 0 0 0	3640 0 5240 0 3452 1960 0 3452 3452 3452 3452 3452 3452 3452 3452
		TOTALS:	66:24	45686
PILOT NR: 5				
50149196 50149167 DAY-OFF DAY-OFF 50149140 WEEK-OFF 50149178 DAY-OFF 50149150 DAY-OFF 50149150 DAY-OFF 50149216 50149186 DAY-OFF 50149221 50149161 DAY-OFF 50149163	10/01/99 07:00 10/03/99 08:30 10/05/99 16:00 10/06/99 16:00 10/07/99 19:30 10/09/99 08:00 10/11/99 08:30 10/16/99 16:00 10/17/99 19:30 10/18/99 16:07 10/21/99 7:00 10/22/99 8:30 10/24/99 13:37 10/26/99 7:00 10/28/99 19:30	10/02/99 08:00 10/05/99 13:37 10/06/99 16:00 10/07/99 16:00 10/08/99 16:07 10/11/99 08:00 10/13/99 13:37 10/16/99 13:37 10/17/99 16:07 10/18/99 16:07 10/299 16:07 10/22/99 8:00 10/24/99 13:37 10/25/99 13:37 10/25/99 13:37 10/27/99 8:00 10/29/99 16:07 10/29/99 16:07 10/30/99 16:07	0 11:42 0 05:13 0 11:42 11:42 0 5:13 0 0 0 11:42 0 0 0 5:13 0 0 05:13 0 0 5:13	$1960 \\ 7869 \\ 0 \\ 0 \\ 3452 \\ 0 \\ 5240 \\ 0 \\ 5240 \\ 0 \\ 0 \\ 1960 \\ 5240 \\ 0 \\ 1960 \\ 3452 \\ 0 \\ 3452 \\ 0 \\ 3452 \\ 0 \\ 3452 \\ 0 \\ 0 \\ 3452 \\ 0 \\ 0 \\ 3452 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ $
		TOTALS:	67:40	45199

PILOT NR: 6

50149197 DAY-OFF 50149168 DAY-OFF 50149204 50149174 50149174 50149145 DAY-OFF 50149210 WEEK-OFF 50149182 DAY-OFF 50149217 50149187 DAY-OFF 50149222 50149224	10/02/99 07:00 10/05/99 08:00 10/06/99 16:07 10/07/99 16:07 10/07/99 07:00 10/10/99 07:00 10/10/99 08:30 10/12/99 19:30 10/13/99 16:07 10/15/99 7:00 10/16/99 16:07 10/22/99 7:00 10/22/99 8:30 10/22/99 16:07 10/27/99 7:00 10/22/99 7:00	10/03/99 08:00 10/06/99 08:00 10/06/99 13:37 10/07/99 16:07 10/10/99 08:00 10/12/99 13:37 10/13/99 16:07 10/14/99 16:07 10/16/99 8:00 10/18/99 16:07 10/21/99 13:37 10/21/99 16:07 10/23/99 8:00 10/25/99 13:37 10/26/99 16:07 10/28/99 8:00 10/30/99 8:00	0 0 11:42 0 0 11:42 05:13 0 0 11:42 0 0 11:42 0 0 11:42 0 0 0	$ 1960 \\ 0 \\ 5240 \\ 0 \\ 1960 \\ 7869 \\ 3452 \\ 0 \\ 1960 \\ 0 \\ 5240 \\ 0 \\ 1960 \\ 6934 \\ 0 \\ 1960 \\ 1960 \\ $
50149194	10/30/99 8:30	TOTALS:	63:43	47429
PILOT NR: 7				
50149166 50149200 DAY-OFF 50149171 50149205 DAY-OFF 50149176 DAY-OFF 50149213 DAY-OFF 50149213 DAY-OFF 50149154 WEEK-OFF 50149154 WEEK-OFF 50149192 50149195	10/02/99 08:30 10/05/99 07:00 10/06/99 08:00 10/07/99 08:30 10/10/99 07:00 10/11/99 08:00 10/12/99 08:30 10/14/99 16:00 10/16/99 07:00 10/18/99 07:00 10/20/99 08:00 10/22/99 16:07 10/22/99 16:07 10/22/99 07:00 10/27/99 08:00 10/28/99 08:30 10/31/99 08:30	10/04/99 13:37 10/06/99 08:00 10/07/99 08:00 10/09/99 13:37 10/11/99 08:00 10/12/99 08:00 10/14/99 13:37 10/15/99 16:00 10/17/99 08:00 10/21/99 08:00 10/22/99 16:07 10/22/99 16:07 10/22/99 16:07 10/26/99 08:00 10/28/99 08:00 10/28/99 08:00 10/30/99 13:37 11/02/99 13:37	11:42 0 11:42 0 11:42 0 11:42 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	6934 1960 0 5240 3640 0 5240 0 1960 1960 0 3452 0 1960 0 5240 7869
PILOT NR: 8		TOTALS.	03.45	40400
WEEK-OFF DAY-OFF 50149138 50149202 DAY-OFF 50149173 50149144 DAY-OFF 50149209 50149179 DAY-OFF 50149214 DAY-OFF 50149214 DAY-OFF 50149185 50149185 50149185 50149182 50149223 50149162 50149226	10/02/99 08:00 10/06/99 08:00 10/05/99 19:30 10/07/99 07:00 10/08/99 08:00 10/199 19:30 10/12/99 16:07 10/14/99 07:00 10/15/99 08:30 10/17/99 16:00 10/15/99 08:00 10/20/99 08:00 10/21/99 08:30 10/24/99 08:30 10/26/99 13:37 10/28/99 07:00 10/29/99 19:30 10/31/99 07:00	10/04/99 08:00 10/06/99 08:00 10/06/99 16:07 10/08/99 08:00 10/09/99 08:00 10/11/99 13:37 10/12/99 16:07 10/13/99 16:07 10/15/99 08:00 10/27/99 13:37 10/28/99 16:07 10/30/99 16:07 11/01/99 08:00	0 05:13 0 11:42 05:13 0 11:42 0 0 11:42 11:42 11:42 0 0 05:13 0	0 0 3452 1960 0 6934 3452 0 1960 5240 0 1960 0 5240 7869 0 1960 3452 3640
		TOTALS:	62:27	47119

HEURISTIC SCHEDULE

KILOMETERS STD DEVIATION: KILOMETERS COEFFICIENT OF VARIATION: SECONDS STD DEVIATION: SECONDS COEFFICIENT OF VARIATION:			410,365 0,8877% 5684,545 2,408833 %	
TASK	BEGIN	END	FLIGHT TIME	KM FLOWN
PILOT NR: 1				
50149135 DAY-OFF 50149138 DAY-OFF 50149172 50149143 DAY-OFF 50149208 DAY-OFF 0AY-OFF 0149184 50149155 DAY-OFF 50149157 50149157 50149221 DAY-OFF 50149193 50149164	10/02/99 19:30 10/03/99 16:07 10/06/99 19:30 10/03/99 16:07 10/08/99 08:30 10/10/99 19:30 10/11/99 16:07 10/13/99 7:00 10/15/99 13:37 10/19/99 08:00 10/20/99 08:30 10/22/99 19:30 10/22/99 19:30 10/22/99 19:30 10/27/99 13:37 10/29/99 08:30 10/27/99 19:30	10/03/99 16:07 10/04/99 16:07 10/07/99 16:07 10/10/99 13:37 10/11/99 16:07 10/12/99 16:07 10/12/99 16:07 10/14/99 8:00 10/16/99 13:37 10/20/99 08:00 10/22/99 13:37 10/23/99 16:07 10/25/99 16:07 10/25/99 16:07 10/27/99 08:00 10/28/99 13:37 10/31/99 13:37 11/01/99 16:07	05:13 0 05:13 0 11:42 05:13 0 0 0 0 11:42 05:13 0 05:13 0 05:13 0 0 11:42 05:13 0 0 11:42 05:13 0 0 11:42 0 0 0 0 0 11:42 0 0 0 0 0 0 0 0 0 0 0 0 0	3452 0 3452 0 5240 5374 0 1960 0 0 5240 3452 0 5374 1960 0 5240 5374
		TOTALS:	66:24	46118
PILOT NR: 2				
50149197 DAY-OFF 50149108 50149203 WEEK-OFF DAY-OFF 50149176 DAY-OFF 50149211 50149219 DAY-OFF 50149219 DAY-OFF 50149190 DAY-OFF 5014925 50149195	10/02/99 07:00 10/03/99 08:00 10/04/99 08:30 10/06/99 19:30 10/08/99 07:00 10/09/99 08:00 10/11/99 08:00 10/12/99 08:30 10/14/99 13:37 10/16/99 07:00 10/27/99 08:30 10/24/99 07:00 10/25/99 08:00 10/26/99 08:30 10/28/99 13:37 10/30/99 07:00 10/31/99 08:30	10/03/99 08:00 10/04/99 08:00 10/06/99 13:37 10/07/99 16:07 10/09/99 08:00 10/11/99 08:00 10/12/99 08:00 10/12/99 13:37 10/15/99 13:37 10/15/99 13:37 10/22/99 08:00 10/26/99 08:00 10/26/99 13:37 10/28/99 13:37 10/31/99 08:00 11/02/99 13:37	0 0 11:42 05:13 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 11:42 0 0 11:42 0 0 11:42 0 0 0 11:42 0 0 11:42 0 0 11:42 0 0 0 11:42 0 0 11:42 0 0 0 11:42 0 0 0 11:42 0 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 0 0 11:42 11:42 0 0 0 11:42 11:42	1960 0 5240 3452 1960 0 5240 0 1960 7869 0 3640 0 5240 0 5240 0 1960 7869
		TOTALS:	63:43	46390
PILOT NR: 3				
50149165 DAY-OFF 50149137 50149201 50149204 DAY-OFF 50149144 50149144 50149145 DAY-OFF DAY-OFF	10/01/99 08:30 10/03/99 16:07 10/04/99 19:30 10/06/99 07:00 10/07/99 19:30 10/10/99 07:00 10/10/99 08:00 10/11/99 19:30 10/12/99 19:30 10/12/99 08:00 10/15/99 08:00	10/03/99 13:37 10/04/99 16:07 10/05/99 16:07 10/07/99 08:00 10/08/99 16:07 10/10/99 08:00 10/11/99 08:00 10/12/99 16:07 10/13/99 16:07 10/15/99 08:00 10/16/99 08:00	11:42 0 05:13 0 05:13 0 0 05:13 05:13 0 0 0	5240 0 3452 1960 3452 1960 0 3452 3452 0 0

50149180 50149151 50149215 DAY-OFF	10/16/99 08:30 10/18/99 19:30 10/20/99 07:00 10/21/99 08:00	10/18/99 13:37 10/19/99 16:07 10/21/99 08:00 10/22/99	11:42 05:13 0	6934 3452 1960
08:00 50149186 50149220 DAY-OFF 50149160 WEEK-OFF	0 10/22/99 08:30 10/25/99 07:00 10/26/99 08:00 10/27/99 19:30 10/29/99 16:00	10/24/99 13:37 10/26/99 08:00 10/27/99 08:00 10/28/99 16:07 10/31/99 16:00	0 11:42 0 05:13 0	5240 1960 0 3452 0
		TOTALS:	66:24	45966
PILOT NR: 4				
DAY-OFF 50149167 50149170 DAY-OFF 50149205 50149175 DAY-OFF 50149147 DAY-OFF 50149212 50149182 50149216 DAY-OFF WEEK-OFF DAY-OFF 50149222 50149192 50149226	10/02/99 08:00 10/03/99 08:30 10/06/99 08:30 10/08/99 13:37 10/10/99 07:00 10/11/99 08:30 10/13/99 13:37 10/14/99 19:30 10/15/99 16:07 10/17/99 07:00 10/22/99 08:00 10/22/99 08:00 10/22/99 13:30 10/27/99 07:00 10/28/99 08:30 10/27/99 07:00	10/03/99 08:00 10/05/99 13:37 10/08/99 13:37 10/09/99 13:37 10/11/99 08:00 10/13/99 13:37 10/14/99 13:37 10/15/99 16:07 10/16/99 16:07 10/20/99 13:37 10/22/99 08:00 10/23/99 08:00 10/25/99 08:00 10/26/99 13:30 10/28/99 08:00 10/30/99 13:37 11/01/99 08:00	0 11:42 11:42 0 0 11:42 0 05:13 0 0 11:42 0 0 0 0 0 11:42 0	$egin{array}{c} 0\\ 7869\\ 5240\\ 0\\ 3640\\ 5240\\ 0\\ 3452\\ 0\\ 3640\\ 5240\\ 1960\\ 0\\ 0\\ 0\\ 0\\ 1960\\ 5240\\ 3640 \end{array}$
		TOTALS:	63:43	47121
PILOT NR: 5				
50149134 50149198 DAY-OFF 50149169 DAY-OFF WEEK-OFF 50149206 DAY-OFF 50149209 50149179 DAY-OFF 50149156 DAY-OFF 50149158 50149158 50149159 DAY-OFF 50149224 50149194	10/01/99 19:30 10/03/99 07:00 10/04/99 08:00 10/05/99 08:30 10/07/99 16:00 10/08/99 16:00 10/11/99 07:00 10/12/99 16:00 10/14/99 7:00 10/15/99 8:30 10/23/99 19:30 10/23/99 19:30 10/22/99 19:30 10/26/99 19:30 10/27/99 16:07 10/25/99 7:00 10/30/99 8:30	10/02/99 16:07 10/04/99 08:00 10/05/99 08:00 10/07/99 13:37 10/08/99 16:00 10/10/99 16:00 10/12/99 08:00 10/13/99 16:00 10/15/99 8:00 10/17/99 13:37 10/20/99 08:00 10/23/99 16:07 10/25/99 16:07 10/25/99 16:07 10/27/99 16:07 10/28/99 16:07 10/28/99 16:07 10/28/99 16:07 10/28/99 16:07	05:13 0 11:42 0 0 0 0 11:42 0 11:42 05:13 0 5:13 0 5:13 0 05:13 0 0 11:42	3452 3640 0 5240 0 1960 5240 0 5240 3452 0 3452 3452 3452 0 1960 6934
		TOTALS:	67:40	45982
PILOT NR: 6				
50149196 50149166 DAY-OFF DAY-OFF 50149171 50149174 DAY-OFF 50149146	10/01/99 07:00 10/02/99 08:30 10/05/99 08:00 10/06/99 08:00 10/07/99 08:30 10/10/99 08:30 10/12/99 16:00 10/13/99 19:30	10/02/99 08:00 10/04/99 13:37 10/06/99 08:00 10/07/99 08:00 10/09/99 13:37 10/12/99 13:37 10/13/99 16:00 10/14/99 16:07	0 11:42 0 0 11:42 11:42 0 05:13	1960 6934 0 5240 7869 0 3452

50149210 DAY-OFF 50149213 50149183 DAY-OFF 50149218 50149188 DAY-OFF 50149223 WEEK-OFF	10/15/99 07:00 10/16/99 13:30 10/18/99 07:00 10/19/99 08:30 10/21/99 13:37 10/23/99 07:00 10/24/99 08:30 10/26/99 16:00 10/28/99 07:00 10/29/99 08:00	10/16/99 08:00 10/17/99 13:30 10/19/99 08:00 10/21/99 13:37 10/22/99 13:37 10/24/99 08:00 10/26/99 13:37 10/27/99 16:00 10/29/99 08:00 10/31/99 08:00	0 0 11:42 0 11:42 0 11:42 0 0 0	1960 0 1960 5240 0 1960 7869 0 1960 0
		TOTALS:	63:43	46404
PILOT NR: 7				
DAY-OFF 50149199 DAY-OFF 50149202 DAY-OFF 50149173 DAY-OFF 50149177 50149148 50149149 DAY-OFF 50149214 50149153 50149217 DAY-OFF WEEK-OFF 50149189 DAY-OFF 50149161 50149162 50149163	10/02/99 08:00 10/04/99 07:00 10/05/99 13:00 10/07/99 07:00 10/08/99 08:00 10/09/99 08:30 10/11/99 16:00 10/13/99 8:30 10/15/99 19:30 10/17/99 16:07 10/19/99 7:00 10/20/99 19:30 10/22/99 7:00 10/23/99 08:00 10/22/99 8:30 10/27/99 13:37 10/28/99 19:30 10/29/99 19:30	10/03/99 08:00 10/05/99 08:00 10/06/99 13:00 10/08/99 08:00 10/11/99 13:37 10/12/99 16:00 10/15/99 13:37 10/16/99 16:07 10/17/99 16:07 10/20/99 8:00 10/21/99 16:07 10/23/99 8:00 10/24/99 08:00 10/27/99 13:37 10/29/99 13:37 10/29/99 16:07 10/30/99 16:07 10/31/99 16:07	0 0 0 0 11:42 05:13 05:13 0 05:13 0 0 05:13 0 0 05:13 0 0 05:13 05:13 05:13 05:13	0 1960 0 6934 0 5240 3452 3452 3452 0 1960 3452 1960 0 0 5240 0 3452 3452 3452 3452 3452
		TOTALS:	66:24	45966
50149136 50149200 DAY-OFF 50149141 50149142 DAY-OFF 50149207 DAY-OFF 50149178 DAY-OFF 50149150 50149152 DAY-OFF 50149154 50149154 50149187 DAY-OFF 50149191 DAY-OFF	10/03/99 19:30 10/05/99 07:00 10/06/99 08:00 10/08/99 19:30 10/10/99 16:07 10/12/99 07:00 10/13/99 08:00 10/14/99 8:30 10/16/99 16:00 10/17/99 19:30 10/21/99 19:30 10/23/99 8:30 10/25/99 16:00 10/27/99 8:30 10/29/99 16:00	10/04/99 16:07 10/06/99 08:00 10/07/99 08:00 10/09/99 16:07 10/10/99 16:07 10/11/99 16:07 10/14/99 08:00 10/14/99 08:00 10/16/99 13:37 10/17/99 16:00 10/18/99 16:07 10/20/99 16:07 10/22/99 16:07 10/25/99 13:37 10/26/99 16:00 10/29/99 13:37 10/29/99 16:00	05:13 0 05:13 05:13 0 0 11:42 0 05:13 05:13 0 05:13 11:42 0 11:42 0	5374 1960 0 3452 3452 0 1960 0 5240 0 5374 3452 0 3452 6934 0 5240 0
		TOTALS:	66:24	45890