

## **NEW APPROACHES TO DEVELOPMENT OF TRANSPORT SCHEDULES**

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## **ABSTRACT**

The authors justify the choice of methods of developing schedules of long-distance trains on the basis of heuristic approaches and taking into account noncyclicity of passenger and freight flows in the Russian context. In the course of algorithmization and development of software for solutions of problems presented the concept of ideology of

greedy algorithms, congestion and uniformity, target programming in the framework of requirements of traffic safety management system, ranking of decision-making theory are used. The two-stage process of procedures includes forming the initial schedule and its subsequent optimization. A mathematical model and algorithms of implementing actions are offered according to the objectives.

<u>Keywords:</u> transport, timetable, schedule development, methodological approaches, heuristics, mathematical model, algorithms.

**Background.** One of the representatives of transport systems with fairly rigid restrictions is a rail transport with its regular seasonal schedule of passenger trains. The task of development of train schedules in scientific publications is usually considered in two forms: cyclic and non-cyclic [1–3].

Cyclic timetables are typical for the Western European countries with high population density and large passenger traffic. These schedules provide strict periodicity within a day or part of a day. In Russian conditions at large distances between major cities cyclical schedules of passenger transportation do not apply.

The schedules of long-distance passenger trains and freight trains are non-cyclic. Mostly their development is based on linear programming procedures. Both models lead to tasks of high dimensionality, for solutions of which different heuristics are used. For example, Lagrange relaxation [4], columns generation [5], unit problem [6].

**Objective.** The article aims to introduce new heuristic methods of developing schedules of long-distance passenger rail transport.

**Methods.** The authors use general scientific and mathematical methods, comparative analysis, evaluation approach, modeling, greedy algorithms, ranking methods within decision-making theory.

Results.

1.

In the process of algorithmization and development of software to generate schedules the authors applied the following concepts [7]: software solution to the problem within the framework of traffic safety control; two-step solution process; ideology of a greedy algorithm; concepts of congestion and uniformity; the use of ranking methods of decision-making theory.

A two-step problem solving process includes the development of an initial schedule and its subsequent optimization. The initial schedule is a schedule created by a program subject to mandatory restrictions. Methods of both phases are cyclical and are completed after inclusion of all routes in the initial schedule, or if it is impossible to further improve schedule.

The task of forming the initial schedule is solved by sequential selection of the next route and its subsequent inclusion in the schedule at the designated time of departure from the starting station. Route selection is based on the concept of congestion, i.e. at each step the busiest route for the required resources is determined. The timing of the inclusion of the route is based on the concept of uniformity of system resources use. That is, at each step of the formation of the initial schedule there are two selection operations.

The task of optimizing the initial timetable is solved with a consistent selection of the most irregular route and its subsequent rearrangement in the schedule at a designated time of departure from the starting station. Rearrangement of the route in the schedule is also based on the concept of uniformity. At each step of optimizing the schedule there are again two selection operations.

This approach is characteristic of greedy algorithms, and it is applicable to problems of formation of schedules and related resource allocation tasks. Using the ideology of greedy algorithms cyclicity of procedures for both phases of the solution of the problem of schedule development is assumed.

Operations of selection under the presented algorithms are multicriteria and for their implementation ranking methods apparatus is attracted [8].

2

Initial task data:

 $S = \left\{ s_i, i = \overline{1, I} \right\}$  – a set of stations of the railway

network;

 $L = \{ I_j, j = \overline{1,J} \}$  – a set of hauls of the railway

 $pI_i$  – a number of platforms for boarding/unboarding of passengers of *i*-th station;

 $\Delta t_{i,\;j}$  – minimum time interval between two successive trains at exit / entrance to j-th haul to the i-th station;

$$F = \{(s, l), s \in S, l \in L\}$$
 – a plurality of incident

pairs – stations is one of two boundary stations of the haul I. Obviously, the number of elements of the set F is  $n = 2 \cdot 1$ :

 $n_r$  – number of routes of the railway network;

 $R = \{ r_k, k = \overline{1, n_r} \}$  – set of vectors of route's

applications:

 $n_{k,s}$  – number of stations of the route  $r_k$ ;

$$r_{k} = \begin{pmatrix} f_{k,i}, & \forall f_{k,i} \in F, & i = \overline{1, n_{k,s}}, \\ k = \overline{1, n_{r}} \end{pmatrix} = \begin{pmatrix} \left( I_{k,i}, S_{k,i} \right), & i = \overline{1, n_{k,s}}, & k = \overline{1, n_{r}} \right) -$$

$$(1)$$

vector of applications of the route  $r_k$  – sequence of pairs – haul/station from the starting to the ending station;

 $n_d$  – number of days of the interval schedule;

 $\overset{\circ}{D}$ ay = (day,, day<sub>2</sub>,..., day<sub>nd</sub>) – ordered by the time vector of the day;

Interval =  $24 \cdot n_d$  – interval of the schedule, hours;  $n_k$  – number of days of departure of trains of the k-th route;

$$Day_k = \left\{ day_{k,i}, \quad i = \overline{1, n_k}, \quad day_{k,i} \in Day \right\}, \quad k = \overline{1, n_r} - a \ \text{set}$$

of days of departure of trains of the routes;

$$n_t = \sum_{k=1}^{n_r} n_k$$
 – number of trains of the schedule;

$$U = \{(r, day), r \in R, day \in Day\}$$
 – a plurality of

incident pairs, partially forming the applications of the trains of routes – the train of the route r should depart from the starting station on the day of day; using (1) we get a plurality of applications of routes of trains:

$$U = \begin{cases} day_{k,j}, \left( \left( I_{k,i}, s_{k,j} \right), & i = \overline{1, n_{k,s}} \right), \\ k = \overline{1, n_r}, & j = \overline{1, n_k}, & day_{k,j} \in Day \end{cases}; \tag{2}$$

$$d_{k,i} = ((l_{k,i}, s_{k,i}, \text{int}_{k,i}), i = \overline{1, n_{k,s}}, k = \overline{1, n_r}) - application$$

to pass the route k along i-th haul to the i-th station, where  $int_{k,i}$  – time interval of movement from (i-1)-th station to the i-th station; application of passage of train  $u_{k,i}$  along i-th haul to the i-th station

$$d_{k,i,j} = \begin{pmatrix} \left(I_{k,i}, s_{k,i}, \operatorname{int}_{k,i}, day_{k,j}\right), & i = \overline{1, n_{k,s}}, \\ k = \overline{1, n_r}, & j = \overline{1, n_k}, & day_{k,j} \in Day \end{pmatrix}, \tag{3}$$

where day  $_{k,j}$  is taken equal to the day of departure of the train of the route.

The initial calculation data of the task:

 $nt_i$ ,  $i = \overline{1,I}$  – number of trains passing through

 $nl_j, \quad j = \overline{1,J} \quad -$  number of trains passing through the j-th haul.

3.

## Variable tasks:

ni – number of routes included in the initial or optimized (rearranged) routes in the schedule;

nr – number of routes not included in the initial schedule or non-optimized routes in the schedule;

nit – number of trains included in the initial schedule;

 $nit_i$  – number of trains included in the initial schedule, passing through the i-th station;

nil, – number of trains included in the initial schedule, passing through the j-th haul;

ti, tf - time of arrival/departure of trains to the station;

til, tfl – time of train entrance to the haul and exit from the haul;

 $TI_{k}$  – time of departure of trains of the route  $r_{k}$  from the starting station,  $TI_{k} = ti_{k}$ ,

The event of the schedule, generated by the application (3), on passage of the train  $u_{k,j}$  of the route  $r_k$  along the i-th haul to the i-th station will be determined by the following expression

$$e_{k,i,j} = \begin{pmatrix} \left( I_{k,i}, s_{k,i}, \text{int}_{k,i}, day_{k,j}, ti_{k,i,j}, tf_{k,i,j} \right), & i = \overline{1, n_{k,s}}, \\ k = \overline{1, n_r}, & j = \overline{1, n_k}, & day_{k,j} \in Day \end{pmatrix}; (4)$$

 $day_{k,l'}$   $ti_{k,l,j}$  and  $tf_{k,l,j}$  in (4) are determined at each step of formation of the schedule;

assessment of occupancy of the i-th station on trains passing through it

$$c1_{i} = \frac{nt_{i} - nit_{i}}{nt - nit}, \quad i = \overline{1, nit_{i}};$$
 (5)

assessment of occupancy of the j-th haul on trains passing through it

$$c2_{j} = \frac{nl_{j} - nil_{j}}{nt - nit}, \quad j = \overline{1, nil_{j}};$$
 (6)

scalar assessment of occupancy of the k-th route for days of the schedule

$$c3_k = \frac{n_k}{n_d}, \quad k = \overline{1, n_r} \; ; \tag{7}$$

Assessment of uniformity of the event of the schedule of the i-th station k1

$$k1_{k,i,j} = \frac{nit_{i} \left( ti_{suc} + ti_{prec} - 2ti_{k,i,j} \right)}{2 * Interval},$$

$$i = \overline{1, n_{k,s}}, \quad k = \overline{1, n_{r}}, \quad j = \overline{1, n_{k}},$$
(8)

where  $ti_{prec}$  and  $ti_{suc}$  – time of arrival to the i-th station of trains, preceding and following with respect to  $ti_{k,i,j}$  in the interval of the schedule;

assessment of uniformity of the event  $e_{k,i,j}$  in the periods of the schedule of the i-th station

$$k2_{k,i,j} = \frac{\sum_{j=1}^{n_d} q(s_{k,i}, t_{k,i,j}, day_{k,j})}{n_{k,i,j}},$$
(9)

where

$$q = q(s_{k,i}, t_{k,i,j}, day_{k,j}) = \begin{cases} 1, & \text{if at least one train} \\ \text{during time } t_{k,k,j} \text{ of the day} \\ \text{day}_{k,j} \text{ is at the station } s_{k,j}, \\ 0 - \text{otherwise}; \end{cases}$$

 $q \in Q_s$  – a set of Boolean notations of the events of stations;

assessment of uniformity of distribution of events  $K1_i$  of the schedule i-th station in the interval of the schedule

$$K1_{i} = \sqrt{\frac{1}{nt_{i}} \sum_{j=1}^{nt_{i}} \left( Int_{i} - Intr_{i,j} \right)^{2}}, \quad i = \overline{1, I},$$
 (10)

where  $Int_i = \frac{Interval}{nt}$ ,  $i = \overline{1,I}$  – average value of the

interval between arrivals of trains to the i-th station;

$$Intr_{i,j} = (ti_{j+1} - ti_j), \quad j = \overline{1, nt_i}, \quad i = \overline{1, I} - value of the$$

interval between arrivals at the station of two trains closest in time. For  $j = nt_i ti_{i+1} = ti_i$ ;

assessment of uniformity of the event of the schedule of the i-th haul k3,

$$k3_{k,i,j} = \frac{nil_{i} \left( ti_{suc} + ti_{prec} - 2ti_{k,i,j} \right)}{2 * Interval},$$

$$i = 1, k = 1, n, i = 1, n.$$
(11)





where  $t_{i_{prec}}$  and  $t_{i_{suc}}$  – time of start of motion of trains on the i-th haul of preceding and following in relation to time  $t_{i_{\nu}}$ ,  $\dot{j}$ :

assessment of uniformity of distribution of the event  $e_{k,l,j}$  in the periods of the schedule of the *i*-th haul at entrance/exit from the station

$$k4_{k,i,j} = \frac{\sum_{j=1}^{n_i} q(l_{k,i}, s_{k,i}, t_{k,i,j}, day_{k,j})}{n_d},$$
(12)

where

$$q = q(s_{k,i}, t_{k,i,j}, day_{k,j}) = \begin{cases} 1, \text{ if at least one train on } t_{k,i,j} \text{ of the day } day_{k,j} \text{ enters or leaves the station } s_{k,i} \text{ to the haul } l_{k,i} \text{ o - otherwise;} \end{cases}$$

 $q \in Q_i$  – a plurality of Boolean notations of the events of the haul:

Assessment of distribution of events K2, of the schedule of the i-th haul in the interval of the schedule

$$K2_{i} = \sqrt{\frac{1}{nl_{i}}} \sum_{j=1}^{nl_{i}} \left( Int_{i} - Intr_{i,j} \right)^{2},$$

$$i = \overline{1.J}.$$
(13)

where  $Int_i = \frac{Interval}{nl_i}, i = \overline{1,J}$  – average value of the

interval between the start of motion of trains on the *i-th* haul:

$$Intr_{i,j} = (ti_{j+1} - ti_j), \quad j = \overline{1, nl_i}, \quad i = \overline{1, J} - value \ of interval between start of motion of trains on the i-th$$

haul of two trains closest in time.

4.

The task of formation of the initial schedule is a step-wise choice of another route  $r_{n+1}$  and formation of the schedule  $S = \left\{TI_i, i=\overline{1, ni+1}\right\}$ , which

minimized multicriterially four vectors of assessment of uniformity of events of stations and hauls of the selected route

$$\min \begin{cases} \left(k1_{ni+1,i,j}, & i = \overline{1, n_{ni+1,s}}, & j = \overline{1, n_{ni+1}}\right) \\ \left(k2_{ni+1,i,j}, & i = \overline{1, n_{ni+1,s}}, & j = \overline{1, n_{ni+1}}\right) \\ \left(k3_{ni+1,i,j}, & i = \overline{1, n_{ni+1,s}}, & j = \overline{1, n_{ni+1}}\right) \\ \left(k4_{ni+1,i,j}, & i = \overline{1, n_{ni+1,s}}, & j = \overline{1, n_{ni+1}}\right) \end{cases}$$

$$(14)$$

at mandatory restrictions

$$\forall s, \forall day, \forall t \quad \sum_{t \in Interval} q \leq pl_i;$$
 (15)

$$\forall l, \forall day, \forall t \quad (til_i - til_{i-1}) \ge \Delta t_{i,j}$$
  
$$\forall l, \forall day, \forall t \quad (tfl_i - tfl_{i-1}) \ge \Delta t_{i,j}.$$
 (16)

The objective function (14) provides a multicriterion minimization of assessment of uniformity of events of the schedule of stations and hauls at inclusion of the next route in the initial schedule. Restrictions (15) relate to the simultaneous location of trains at the station in the range of not more than the number of tracks with passenger platforms. Restrictions (16) reflect required intervals between successive entrances and exits of trains from the station and to the station.

Assessment of occupancy of stations (5) and hauls (6) form a plurality of the first and second vector components of routes' congestion:

$$\left\{\left(c1_{1,k},c1_{2,k},\ldots,c1_{i,k},\quad i=\overline{1,n_{k,s}}\right),\quad k=\overline{1,nr}\right\};\tag{17}$$

$$\left\{ \left(c2_{1,k},c2_{2,k},\ldots,c2_{i,k},\ i=\overline{1,n_{k,s}-1}\right),\ k=\overline{1,nr}\right\}.$$
 (18)

Multicriteria ranking of vectors (17) and (18) generates a plurality of ranks of routes according to occupancy of stations and hauls:

$$\left\{ \operatorname{rank} 1_k, \quad k = \overline{1, nr} \right\}; \tag{19}$$

$$\left\{ \operatorname{rank2}_{k}, \quad k = \overline{1, nr} \right\}. \tag{20}$$

Reverse sorting of expressions (7) generates a plurality of ranks of routes according to occupancy of days of the interval of the schedule

$$\{ rank3, k \overline{1, nr} \}.$$
 (21)

Ranks (19, 20, 21) form a set of vectors of routes

$$\left\{ \left( rank1_{k}, rank2_{k}, rank3_{k} \right), \quad k = \overline{1, nr} \right\}. \tag{22}$$

Route senior in rank, obtained due to multicriteria ranking of vectors (22), is the busiest and becomes the next candidate  $r_{ni+1}$  for inclusion in the initial schedule.

To determine time of departure from the starting station  $TI_{ni+1}$  of trains of the route  $r_{ni+1}$  the following actions are performed cyclically:

for  $t_{n+1,1} = 0$  in increments of = 0,1 hours to 24 hours determination of values of estimates (8, 9, 11, 12) for all hauls and stations of the route with account of restrictions (15, 16) and accumulation of a set of vectors

$$\left\{ t_{n_{i+1,1}}, \left( k 1_{n_{i+1,i,j}}, \quad i = \overline{1, n_{n_{i+1,s}}}, \quad j = \overline{1, n_{n_{i+1}}} \right) \right\}; \tag{23}$$

$$\left\{ti_{ni+1,1},\left(k2_{ni+1,i,j},\quad i=\overline{1,n_{ni+1,s}},\quad j=\overline{1,n_{ni+1}}\right)\right\};\tag{24}$$

$$\{ti_{ni+1,1},(k3_{ni+1,i,j}, i=\overline{1,n_{ni+1,s}}, j=\overline{1,n_{ni+1}})\};$$
 (25)

$$\{ti_{ni+1,1}, (k4_{ni+1,i,j}, i = \overline{1, n_{ni+1,s}}, j = \overline{1, n_{ni+1}})\}.$$
 (26)

Multicriteria ranking of vectors (23, 24, 25, 26) form sets of vectors of ranks for the time of starting motion of trains of the route  $r_{ni+1}$ 

$$\begin{cases} ti_{ni+1,1}, (rank1, rank2, rank3, rank4), \\ ti_{ni+1,1} = \overline{0, 240} \end{cases} . \tag{27}$$

Multicriteria ranking of vectors (27) determines the starting time  $TI_{n_{i+1}}$  of motion of trains of the route  $r_{n_{i+1}}$  in the initial schedule.

5.

The task of optimizing the initial schedule is a stepwise choice of a next route  $r_{n+1}$  and formation

of a schedule  $S = \left\{TI_i, i = \overline{1, ni+1}\right\}$  that minimizes multicriterially two vectors of assessment of uniformity of stations and hauls of the selected route

$$\min \begin{cases} \left(K1_{i}, & i = \overline{1, I}\right) \\ \left(K2_{i}, & i = \overline{1, J}\right) \end{cases}$$
 (28)

at mandatory restrictions (15) and (16).

The objective function (28) minimizes the meansquare deviations of intervals between events at stations and hauls. The objective function is related to the necessity of multi-criteria ranking of derived vectors (28). The completion of the initial transport schedule optimization is due to action strategy taken.

Estimates of uniformity of distribution of events of station schedules (10) and hauls (13) form a plurality of first and second vector components of uniformity of routes on the next step in optimizing the initial schedule

$$\begin{cases}
 \left( \alpha_{s,l} K 1_{l,k}, \quad \alpha_{s,2} K 1_{2,k}, \dots, \\
 \alpha_{s,k} K 1_{i,k}, \quad i = \overline{1, n_{k,s}} \right), \\
 k = \overline{1, nr}
\end{cases}$$
(29)

where  $\alpha_{s,i}$  – coefficient of importance of assessment,

$$\alpha_{s,i} = \frac{nt_i}{\sum_{i=1}^{I} nt_j}$$

where  $\alpha_{i}$  – coefficient of importance of assessment,

$$\alpha_{l,i} = \frac{nl_i}{\sum_{j=1}^{J} nl_j}$$

Multicriteria ranking of vectors (29) generates a plurality of ranks of routes in uniformity of stations

$$\left\{ \operatorname{rank} 1_{k}, \quad k = \overline{1, nr} \right\}. \tag{31}$$

Multicriteria ranking of vectors (30) generates a plurality of ranks of routes in uniformity of hauls  $\{ rank2_k, k = \overline{1,nr} \}$ . (32)

Ranks (31, 32) form a set of vectors (uniformity criteria) of routes

$$\{(rank1_k, rank2_k), k = \overline{1, nr}\}.$$
 (33)

The route senior in rank, obtained by multicriteria ranking of vectors (33), is the most unequal at taken estimates and criteria of uniformity. It becomes a next candidate  $r_{ni+1}$  for rearrangement in the initial schedule.

To determine the time of departure from the starting station  $TI_{ni+1}$  of trains of the route  $r_{ni+1}$  the following actions are performed cyclically:

for  $ti_{ni+1,1} = 0$  in increments of = 0,1 hours to 24 hours determination of values of estimates (10, 13) for all hauls and stations of the route with account of restrictions (15, 16) and accumulation of a set of vectors

$$\left\{ ti_{ni+1,1}, \begin{pmatrix} \alpha_{s,i} K 1_{ni+1,i,j}, \\ i = \overline{1, n_{ni+1,s}}, & j = \overline{1, n_{ni+1}} \end{pmatrix} \right\};$$
(34)

$$\left\{ t_{n_{i+1,1}}, \begin{pmatrix} \alpha_{i,j} K 2_{n_{i+1,j,j}}, \\ i = \overline{1}, n_{n_{i+1,s}}, \quad j = \overline{1}, n_{n_{i+1}} \end{pmatrix} \right\}.$$
(35)

Multicriteria ranking of vectors for sets of vectors of ranks for the initial time of starting motion of trains of the route  $\mathbf{r}_{\text{\tiny ni-1}}$ 

$$\{ti_{ni+1,1}, (rank1, rank2), ti_{ni+1,1} = \overline{0,240}\}.$$
 (36)

Multicriteria ranking of vectors (36) determines the desired starting time  $TI_{n+1}$  of motion of trains of the route  $r_{n+1}$  in the optimized schedule of the railway network

**Conclusion.** The proposed mathematical model and algorithms of formation and optimization of the initial schedule are to be implemented in software as part of the traffic safety control system.

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