# Crew Scheduling

### Crew Scheduling Problem

#### Outline

- Crew Scheduling
- Work Rules and Policies
- Manual Scheduling Process
- Model Formulation
- Automated Scheduling

#### Input

- A set of vehicle blocks each starting with a pull-out and ending with a pull-in at the depot
- Crew work rule constraints and pay provisions

#### Objective

• Define crew duties (i.e. runs, days, or shifts) covering all vehicle block time so as to minimize crew costs

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# Crew Scheduling Problem

#### Constraints

- Work rules (hard constraints)
- Policies (preferences or soft constraints)
- Crews available
  - $\circ \ \ \,$  in the short run, the number of crews available are known

#### Variations

- different crew types
  - full-time
  - part-time
- mix restrictions
  - o constraints on maximum number of part-timers

### Typical Crew Scheduling Approach

#### Three-stage sequential approach

- 1. Cutting long vehicle blocks into pieces of work
- 2. Combining pieces to form alternative runs • with meal breaks, etc.
- 3. Selection of minimum cost set of runs
- manual process includes only steps 1 and 2

   also accomplished with automatic heuristics
- optimization process also involves step 3

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# Typical Crew Scheduling Approach

#### 1 - Cutting Blocks

- each block consists of a sequence of vehicle revenue trips and non-revenue activities
- blocks can be cut only at relief points where one crew can replace another.
- relief points are typically at terminals which are accessible
   but en-route timing points are an option

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- avoid cuts within peak period
  - $\circ \quad$  don't complicate an already stressed part of operations
- resulting pieces
  - have minimum and maximum lengths
  - $\circ$   $\;$  should be combinable to form legal runs
    - meal break
    - maximum spread

### Vehicle Block Partitions

**Definition** a *partition* of a block is the selection of a set of cuts each representing a relief.

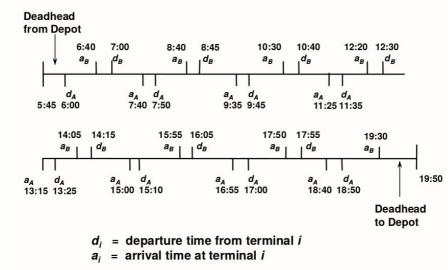
#### Key problems

- very hard to evaluate a partition before forming runs
- many partitions are possible for any vehicle block

#### **Possible Approaches**

- generate only one partition for each vehicle block
- generate multiple partitions for each vehicle block
- generate all possible partitions for each vehicle block





### **Combining Pieces of Work to Form Runs**

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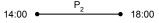
#### 2 - Combining Pieces

- Large number of feasible runs by combining pieces of work
- Work rules are complex and constraining
  - maximum work hours: e.g. 8 hrs 15 min
    - minimum paid hours (guarantee time): e.g. 8 hrs
  - overtime constraints and pay premiums:
     e.g. 50% pay premium
- Spread constraints and pay premiums: time between first report and last release for duty,

e.g.,

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 $6:00 \quad \bullet \quad P_1 \quad \bullet \quad 10:00$ 



has a spread of 12 hours.

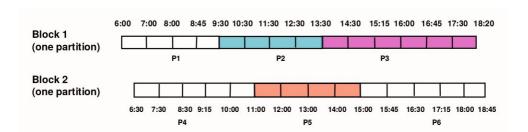
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# Combining Pieces of Work to Form Runs

• Swing pay premiums associated with runs with pieces which start and end at different locations, e.g.,



- Different types of duties
  - straight: a continuous run
  - split: a two-piece run
  - trippers: a short run, usually worked on overtime
- Approach: generate and cost out each feasible run
  - infeasible runs are not generated



**Combining Pieces of Work to Form Runs** 

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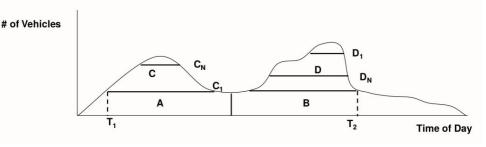
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### **Combining Pieces of Work to Form Runs**

	Block 1 (one parti Block 2 (one parti	ition)	P1	0 10:30 11:30 12: P2 10:00 11:00 12:00	30 13:30 14:00 P5	P3
Run #	1st piece	2nd piece	Spread Time	Work Time	Cost	Possible Runs from pieces P1-P6
1	P1	P2	07:30	07:30	C1	
2	P1	P3	12:20	08:20	C2	
3	P1	P5	09:00	07:30	C3	
4	P1	P6	12:45	07:15	C4	
5	P2	P3	08:50	08:50	C5	
6	P2	P6	09:15	07:45	C6	
7	P4	P3	11:50	09:20	C7	Illegal run: Max work time violation
8	P4	P5	08:30	08:30	C8	
9	P4	P6	12:15	08:15	C9	
10	P5	P6	07:45	07:45	C10	

### Crew Scheduling: Manual Techniques





- T1 is earliest AM pullout which can still serve PM peak
- T2 is latest PM pullback which can still serve AM peak
- A are AM straights (or short split runs)
- B are PM straights (or short split runs)
- C and D are long split or part time runs

# Typical Sequence

- 1. Based on total vehicle hours, estimate total operators required
- 2. Determine # operators required in AM and PM peaks
- 3. Determine B based on: # of pull-ins after time  $T_2$ .
- 4. Determine # split runs: (# of PM Peak Vehicles B)
- 5. Determine A based on: # of AM Peak Vehicles split runs
- Combine earliest pullouts in C with earliest pull-ins in D to produce minimum spread split runs C<sub>1</sub>D<sub>1</sub>. Iterate until all split runs are matched C<sub>N</sub>D<sub>N</sub>.

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# Examples (1/2)

Time Period	# Vehicles	Period Length	# Vehicle Hours
AM Peak	8	3	24
Base	4	6	24
PM Peak	8	3	24
Evening	4	6	24
			96
			12 FTOs

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Examples (1/2)

Time Period	# Vehicles	Period Length	# Vehicle Hours
AM Peak	8	3	24
Base	4	6	24
PM Peak	8	3	24
			PM + Evening runs = 4 (Straight)
Evening	4	6	24
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Time Period	# Vehicles	Period Length	# Vehicle Hours
AM Peak	8	3	24
Base	6	6	36
PM Peak	8	3	24
Evening	3	6	18
			102 13 FTOs

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# Examples (2/2)

Time Period	# Vehicles	Period Length	# Vehicle Hours
AM Peak	8	3	24
Base	6	6	36
PM Peak	8	3	24
			PM + Evening runs = 3 (Straight)
Evening	3	6	18
			PM + Evening runs = 3 (Straight)
			102 13 FTOs

# Examples (2/2)

Time Period	# Vehicles	Period Length	# Vehicle Hours
AM Peak	8	3	24
			AM + PM runs = 5 (Split)
Base	6	6	36
PM Peak	8	3	24
			PM + Evening runs = 3 (Straight) AM + PM runs = 5 (Split)
Evening	3	6	18
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PM Peak	8	3	24
			PM + Evening runs = 3 (Straight AM + PM runs = 5 (Split)
Evening	3	6	18
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### **Examples (2/2)- Start from AM**

Time Period	# Vehicles	Period Length	# Vehicle Hours
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3	6	18
		102 13 FTOs
	8 6 8	8     3       6     6       8     3       8     3

# **Examples (2/2)- Start from AM**

Time Period	# Vehicles	Period Length	# Vehicle Hours
AM Peak	8	3	24
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Base	6	6	36
			AM + Base runs = 6 (Straight)
PM Peak	8	3	24
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### Selection of Minimum Cost Set of Runs

- Usually built around mathematical programming formulation
- **Problem** Given a set of *m* trips and a set of *n* feasible driver runs, find a subset of the *n* runs which cover all trips at minimum cost

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# Mathematical Model for Crew Scheduling

#### Basic Model Set Partitioning Problem

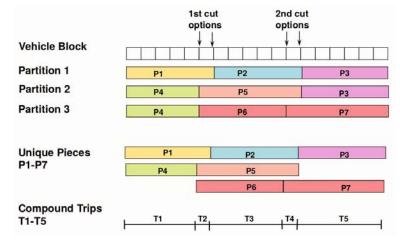
Notation

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- P = set of trips to be covered
- R = set of feasible runs
- c<sub>i</sub> = cost of run j
  - δ<sup>j</sup> = binary parameter
    - 1 trip (or set of trips) i is included in run j
    - 0 not included
- x<sub>i</sub> = binary decision variable
  - 1 run j is selected
  - 0 not selected

# Min $\sum_{j \in R} c_j x_j$ Subject to : $\sum_{j \in R} x_j \delta_i^j = 1 \qquad \forall i \in P$ $x_j \in \{0,1\}, \qquad \forall j \in R$

### Partitions of Vehicle Block, Pieces of Work, and Compound Trip



### Mathematical Model for Crew Scheduling

- Problem size
  - R decision variables (likely to be in millions)
  - P constraints (likely to be in thousands)
  - much more difficult than the MDVSP
    - complex work rules
    - many valid duties
- Problem size reduction strategy
  - replace individual trips with compound trips consisting of a sequence of vehicle trips which will always be served by a single crew
  - sometimes the first constraint is relaxed to simplify computation
    - allow more than one driver per trip
    - usually leads to few cases of overcovering, which can be eliminated afterwards with heuristics
- Optimization methods
  - column generation
  - branch and price
  - heuristics, e.g. genetic algorithms

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# Variations of Set Partitioning Problem

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- 1. Set R consists of all feasible runs given all feasible partitions for all vehicle blocks
  - $\circ$   $\,$  size of model explodes with  $\,$  problem size  $\,$
  - $\circ$   $\,$  only possible for small problems
- 2. Set R consists of a subset of all feasible runs
  - not guaranteed to find an optimal solution
  - $\circ$   $\;$  effectiveness will depend on quantity and quality of runs included
- 3. Column generation based on starting with a subset of runs and generating additional runs which will improve the solution as part of the model solution process.

# Model with Side Constraints

Often the number (or mix) of crew types is constrained in various ways which can be formulated as side constraints

Example: Suppose total tripper hours are constrained to be less than 25% of timetable time.

Let WT = total timetable time  
Let WT = total timetable time  
$$R^{T}$$
 = set of tripper runs  
 $t_{j}$  = work time for tripper run j

Then the additional constraint is

 $\sum_{j \in R^T} t_j x_j \le 0.25 \text{ WT}$ 

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# Automated Crew Scheduling Systems

- Evolution of software has been from "black box" optimization/heuristics to highly interactive and graphical tools
- Current systems allow much greater ability to "shape" the solution to the needs of specific agencies
- One implication however is a profusion of these "soft" parameters which means greater complexity and it is very hard to get full value out of systems.

### Automated Crew Scheduling Systems

- Virtually universally used in medium and large operators worldwide
- Two most widely used commercial packages are HASTUS (by GIRO Inc in Montreal) and Trapeze (by Trapeze Software Inc in Toronto/Phoenix), each with over 200 customers worldwide
- Typical cost ranges from \$100K to \$2 M for the software
- Key benefits of automated scheduling are:
  - $\circ$   $\,$  scheduling process time reductions
  - improved accuracy
  - modest improvements in efficiency (typically 0-3%)
  - provides a key database for many other applications

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### **Rostering**

**Problem** Given duties for a week or a month, combine duties to form rosters

#### Approaches

- Optimization
  - Minimize required drivers
  - Distribute work evenly most common in Europe
  - Improve likeability
    - consecutive days off
    - Monday-Friday with weekend off
  - Very large problem: exact OR formulations are seldom used
- Cafeteria pick
  - Most common in North America
  - $\circ \quad \text{Pick in order of seniority} \\$

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