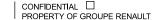
LP/MIP @ RENAULT SUPPLY CHAIN













Digital Transformation

Applied Al chapter 12 staff



Product configuration Knowledge compilation

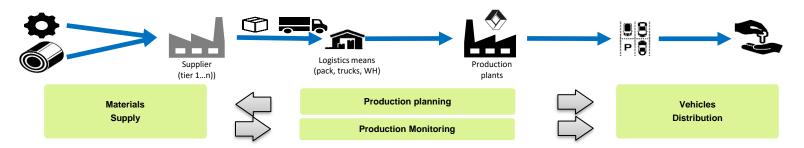


Natural Language Processing



Operations Research (5 staff + 2 interns)

RENAULT END TO END SUPPY-CHAIN: KEY FIGURES



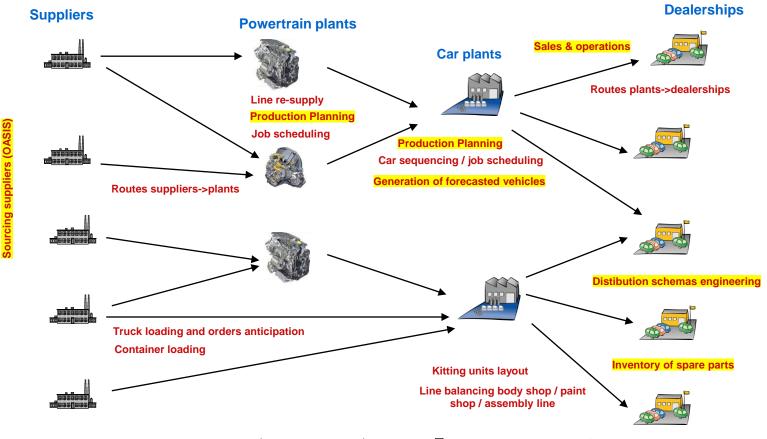
- 3,500 trucks or containers/day to supply our plants
- 200,000 m3 of transported parts/day
- 3,500 supplier sites
- 13 logistics platforms

- 40 Renault plants in 17 countries
- 7,500 model versions
- 300,000 parts references

- Around 2,000 trucks or boats per day to deliver our cars
- To over 5,000 destinations
- Over 200 ports used worldwide

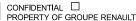


OR tools in the supply chain







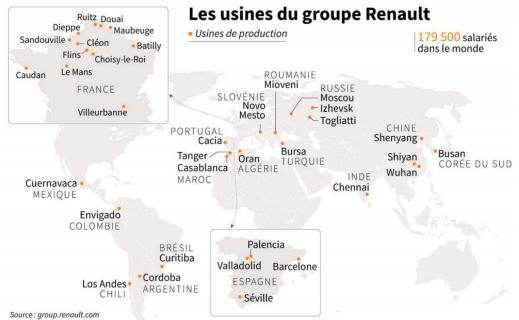


Whenever LP/MIP could be used, it was used!

Solvers: CPLEX since 1992, COIN/OR ... but also CPO, LocalSolver

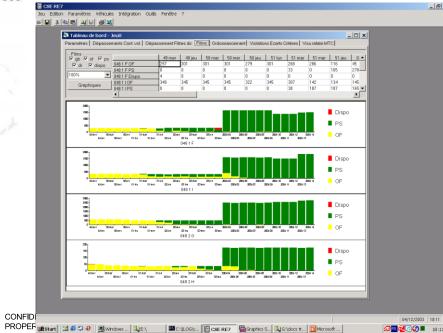






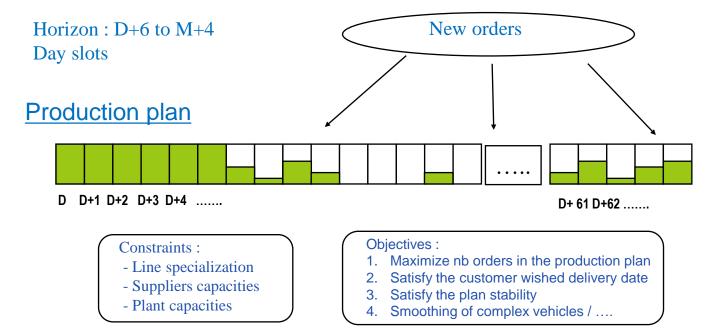
Planning tool in every RENAULT's car factory worldwide Mission: to optimize the daily production plan Scope: total production of 2M vehicles in 2022

Car Production planning (daily)





Car production planning



Multi-objective optimization (LP), customized for each plant



DIGITAL TRANSFORMATION

REDACTOR APPLIED AI CHAPTER

Car sequencing (daily)

Production sequence

Paint batches

Paint batches

Paint batches

Paint batches

- ▶ Paint batches
 - ✓ Minimize solvent consumption due to paint color changes
- ▶ Spacing for the assembly shop : spacing ratios (ex: DD DD ¼)
 - ✓ To smooth complex vehicles
 - ✓ Not to overburden workstations

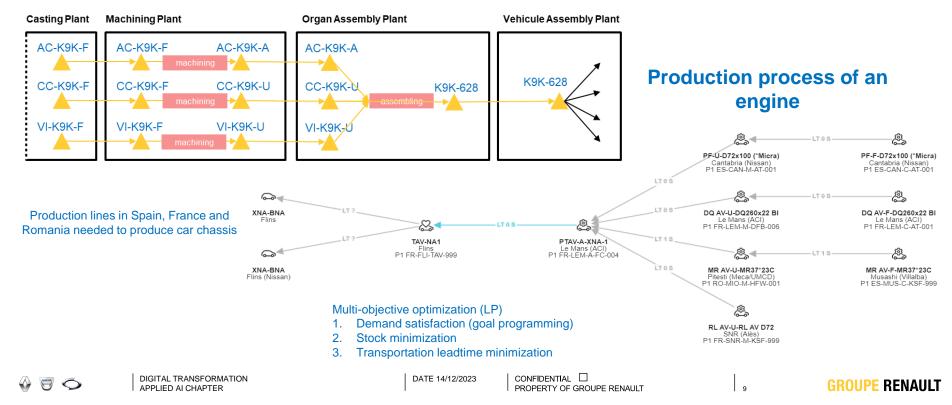


Engine/gearbox production planning (monthly)

Planning tool for engines, gearboxes, and all their components

Mission: to optimize the production plan for the next 18 months & solve capacity bottlenecks

Scope: 985 production lines worldwide

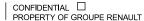


Goal programming (LP)

mFab 4646	FabCalc	DemFab	FabCalc	DemFab	E-EC-I-					REN Italie				REN Portugal		Total	
4646				D'UIII GIO	FabCaic	DemFab	FabCalc	DemFab	FabCalc	DemFab	FabCalc	DemFab	FabCalc	DemFab	FabCalc	DemFab	FabCalc
10.10	4619	289	275	170	162	156	156	122	116	3362	3362	1257	1257	616	616	21346	21349
729	949	505	480	237	226	46	44	162	154	2792	2792	1121	1065	208	198	17432	17453
1056	1056	106	106	938	938	109	109	22	21	89	89	321	337	12	12	8693	8693
581	552	219	219	358	358	505	505	52	52	120	120	572	543	11	11	6613	6614
725	725	24	24	283	283	299	299	14	14	76	76	245	245	20	20	3402	3402
520	497	369	353	112	107	3	3	96	91	503	482	1855	1774	620	593	10248	9987
2121	2026	2927	2796	1343	1340	219	209	1386	1319	3918	3743	10551	10078	926	885	62860	60064
275	262	272	259	184	175	36	34	307	292	337	321	545	519	175	167	9995	9521
126	120	61	58	0	0	27	26	15	14	89	85	295	281	0	0	1992	1899
2122	2122	259	247	376	375	240	228	120	120	669	669	1113	1113	536	509	14294	14294
3169	3169	314	314	928		459	459	74			1934	1707	1707	165	165	25912	25922
25	161	42			67	13	134	6	5	110			0	0	0	3552	4268
743	706	482			85				149	1662	1579	2001	1901	745	709	20981	19938
286	272	55	53	149	142	319	303	35	34	125	119	217	207	20	19	3631	3455
		0	4	0	5											0	42
																45	45
0	1	14	14	8	В	18	18	0	1	125	119	0	В	39	39	768	838
		0	4	0	6											0	46
																135	129
17124	17237	5938	5746	5228	5205	2449	2527	2567	2456	15911	15578	21800	21035	4093	3943	212295	208003
	581 725 520 2121 275 126 2122 3169 25 743 286	581 552 725 725 520 497 2121 2026 275 262 126 120 2122 2122 3169 3169 25 161 743 706 286 272	581 552 219 725 725 24 520 497 369 2121 2026 2927 275 262 272 126 120 61 2122 2122 259 3169 3169 314 25 161 42 743 706 482 286 272 55 0	581 552 219 219 725 725 24 24 520 497 369 353 2121 2026 2927 2796 275 262 272 259 126 120 61 58 2122 2122 259 247 3169 3169 314 314 25 161 42 82 743 706 482 458 286 272 55 53 0 4	581 552 219 218 358 725 725 24 24 283 520 497 369 353 112 2121 2026 2927 2796 1343 275 262 272 259 184 126 120 61 58 0 2122 2122 259 247 376 3169 3169 314 314 928 25 161 42 82 53 743 706 482 458 89 286 272 55 53 149 0 4 0 0 1 14 14 8 0 4 0	581 552 219 219 358 358 725 725 24 24 283 283 520 497 369 353 112 107 2121 2026 2927 2796 1343 1340 275 262 272 259 184 175 126 120 61 58 0 0 0 2122 2122 259 247 376 375 3169 3169 314 314 928 928 25 161 42 82 53 67 743 706 482 458 89 85 286 272 55 53 149 142 0 4 0 5 0 1 14 14 8 8 0 1 14 14 8 8 0 4 0	581 552 219 219 358 358 505 725 725 24 24 283 283 299 520 497 369 353 112 107 3 2121 2026 2927 2796 1343 1340 219 275 262 272 259 184 175 36 126 120 61 58 0 0 27 2122 2122 259 247 376 375 240 3169 3169 314 314 928 928 459 25 161 42 82 53 67 13 743 706 482 458 89 85 286 272 55 53 149 142 319 0 4 0 5	581 552 219 219 358 358 505 505 725 725 24 24 283 283 299 299 520 497 369 353 112 107 3 3 2121 2026 2927 2796 1343 1340 219 209 275 262 272 259 184 175 36 34 126 120 61 58 0 0 27 26 2122 2122 259 247 376 375 240 228 2122 2122 259 247 376 375 240 228 3169 314 314 928 928 459 459 25 161 42 82 53 67 13 134 743 706 482 458 89 85 286 272	581 552 219 219 358 358 505 505 52 725 725 24 24 283 283 299 299 14 520 497 369 353 112 107 3 3 96 2121 2026 2927 2796 1343 1340 219 209 1386 275 262 272 259 184 175 36 34 307 126 120 61 58 0 0 27 26 15 2122 2122 259 247 376 375 240 228 120 3169 3149 314 928 928 459 459 74 25 161 42 82 53 67 13 134 6 743 706 482 458 89 85 156 286 272 </td <td>581 552 219 219 358 358 505 505 52 52 725 725 24 24 283 283 299 299 14 14 520 497 369 353 112 107 3 3 96 91 2121 2026 2927 2796 1343 1340 219 209 1386 1319 275 262 272 259 184 175 36 34 307 292 126 120 61 58 0 0 27 26 15 14 2122 2122 259 247 376 375 240 228 120 120 3169 3149 314 928 928 459 459 74 74 25 161 42 82 53 67 13 134 6 5 743<td>581 552 219 219 358 358 505 505 52 52 120 725 725 24 24 283 283 299 299 14 14 76 520 497 369 353 112 107 3 3 96 91 503 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 275 262 272 259 184 175 36 34 307 292 337 126 120 61 58 0 0 27 26 15 14 89 2122 2122 259 247 376 375 240 228 120 120 669 3169 3149 314 928 928 459 459 74 74 1934 25 161 42 <</td><td>581 552 219 219 358 358 505 505 52 52 120 120 725 725 24 24 283 283 299 299 14 14 76 76 520 497 369 353 112 107 3 3 96 91 503 482 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 275 262 272 259 184 175 36 34 307 292 337 321 126 120 61 58 0 0 27 26 15 14 89 85 2122 2122 259 247 376 375 240 228 120 120 669 669 3169 314 314 928 928 459 459</td><td>581 552 219 219 358 358 505 505 52 52 120 120 572 725 725 24 24 283 283 299 299 14 14 76 76 245 520 497 369 353 112 107 3 3 96 91 503 482 1855 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 275 262 272 259 184 175 36 34 307 292 337 321 545 126 120 61 58 0 0 27 26 15 14 89 85 295 2122 2122 259 247 376 375 240 228 120 120 669 669 1113</td><td>581 552 219 219 358 358 505 505 52 52 120 120 572 543 725 725 24 24 283 283 299 299 14 14 76 76 245 245 520 497 369 353 112 107 3 3 96 91 503 482 1855 1774 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 275 262 272 259 184 175 36 34 307 292 337 321 545 519 126 120 61 58 0 0 27 26 15 14 89 85 295 281 2122 2122 259 247 376 375 240 228</td><td>581 552 219 219 358 358 505 505 52 52 120 120 572 543 11 725 725 24 24 283 283 299 299 14 14 76 76 245 245 20 520 497 369 353 112 107 3 3 36 91 503 482 1855 1774 620 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 926 275 262 272 259 184 175 36 34 307 292 337 321 545 519 175 126 120 61 58 0 0 27 26 15 14 89 85 295 281 0 2122 2122</td><td>681 552 219 219 358 358 505 505 52 52 120 120 572 543 11 11 725 725 24 24 283 283 299 299 14 14 76 76 245 245 20 20 520 497 369 353 112 107 3 3 96 91 503 482 1855 1774 620 593 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 926 885 275 262 272 259 184 175 36 34 307 292 337 321 545 519 175 167 126 120 61 58 0 0 27 26 15 14 89 85 295</td><td>681 552 219 219 358 358 505 505 52 52 120 120 572 543 11 11 6613 725 725 24 24 283 283 299 299 14 14 76 76 245 245 20 20 3402 520 497 369 353 112 107 3 3 96 91 503 482 1855 1774 620 593 10248 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 926 885 6260 275 262 272 259 184 175 36 34 307 292 337 321 545 519 175 167 9995 126 120 61 58 0 0 27 2</td></td>	581 552 219 219 358 358 505 505 52 52 725 725 24 24 283 283 299 299 14 14 520 497 369 353 112 107 3 3 96 91 2121 2026 2927 2796 1343 1340 219 209 1386 1319 275 262 272 259 184 175 36 34 307 292 126 120 61 58 0 0 27 26 15 14 2122 2122 259 247 376 375 240 228 120 120 3169 3149 314 928 928 459 459 74 74 25 161 42 82 53 67 13 134 6 5 743 <td>581 552 219 219 358 358 505 505 52 52 120 725 725 24 24 283 283 299 299 14 14 76 520 497 369 353 112 107 3 3 96 91 503 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 275 262 272 259 184 175 36 34 307 292 337 126 120 61 58 0 0 27 26 15 14 89 2122 2122 259 247 376 375 240 228 120 120 669 3169 3149 314 928 928 459 459 74 74 1934 25 161 42 <</td> <td>581 552 219 219 358 358 505 505 52 52 120 120 725 725 24 24 283 283 299 299 14 14 76 76 520 497 369 353 112 107 3 3 96 91 503 482 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 275 262 272 259 184 175 36 34 307 292 337 321 126 120 61 58 0 0 27 26 15 14 89 85 2122 2122 259 247 376 375 240 228 120 120 669 669 3169 314 314 928 928 459 459</td> <td>581 552 219 219 358 358 505 505 52 52 120 120 572 725 725 24 24 283 283 299 299 14 14 76 76 245 520 497 369 353 112 107 3 3 96 91 503 482 1855 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 275 262 272 259 184 175 36 34 307 292 337 321 545 126 120 61 58 0 0 27 26 15 14 89 85 295 2122 2122 259 247 376 375 240 228 120 120 669 669 1113</td> <td>581 552 219 219 358 358 505 505 52 52 120 120 572 543 725 725 24 24 283 283 299 299 14 14 76 76 245 245 520 497 369 353 112 107 3 3 96 91 503 482 1855 1774 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 275 262 272 259 184 175 36 34 307 292 337 321 545 519 126 120 61 58 0 0 27 26 15 14 89 85 295 281 2122 2122 259 247 376 375 240 228</td> <td>581 552 219 219 358 358 505 505 52 52 120 120 572 543 11 725 725 24 24 283 283 299 299 14 14 76 76 245 245 20 520 497 369 353 112 107 3 3 36 91 503 482 1855 1774 620 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 926 275 262 272 259 184 175 36 34 307 292 337 321 545 519 175 126 120 61 58 0 0 27 26 15 14 89 85 295 281 0 2122 2122</td> <td>681 552 219 219 358 358 505 505 52 52 120 120 572 543 11 11 725 725 24 24 283 283 299 299 14 14 76 76 245 245 20 20 520 497 369 353 112 107 3 3 96 91 503 482 1855 1774 620 593 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 926 885 275 262 272 259 184 175 36 34 307 292 337 321 545 519 175 167 126 120 61 58 0 0 27 26 15 14 89 85 295</td> <td>681 552 219 219 358 358 505 505 52 52 120 120 572 543 11 11 6613 725 725 24 24 283 283 299 299 14 14 76 76 245 245 20 20 3402 520 497 369 353 112 107 3 3 96 91 503 482 1855 1774 620 593 10248 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 926 885 6260 275 262 272 259 184 175 36 34 307 292 337 321 545 519 175 167 9995 126 120 61 58 0 0 27 2</td>	581 552 219 219 358 358 505 505 52 52 120 725 725 24 24 283 283 299 299 14 14 76 520 497 369 353 112 107 3 3 96 91 503 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 275 262 272 259 184 175 36 34 307 292 337 126 120 61 58 0 0 27 26 15 14 89 2122 2122 259 247 376 375 240 228 120 120 669 3169 3149 314 928 928 459 459 74 74 1934 25 161 42 <	581 552 219 219 358 358 505 505 52 52 120 120 725 725 24 24 283 283 299 299 14 14 76 76 520 497 369 353 112 107 3 3 96 91 503 482 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 275 262 272 259 184 175 36 34 307 292 337 321 126 120 61 58 0 0 27 26 15 14 89 85 2122 2122 259 247 376 375 240 228 120 120 669 669 3169 314 314 928 928 459 459	581 552 219 219 358 358 505 505 52 52 120 120 572 725 725 24 24 283 283 299 299 14 14 76 76 245 520 497 369 353 112 107 3 3 96 91 503 482 1855 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 275 262 272 259 184 175 36 34 307 292 337 321 545 126 120 61 58 0 0 27 26 15 14 89 85 295 2122 2122 259 247 376 375 240 228 120 120 669 669 1113	581 552 219 219 358 358 505 505 52 52 120 120 572 543 725 725 24 24 283 283 299 299 14 14 76 76 245 245 520 497 369 353 112 107 3 3 96 91 503 482 1855 1774 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 275 262 272 259 184 175 36 34 307 292 337 321 545 519 126 120 61 58 0 0 27 26 15 14 89 85 295 281 2122 2122 259 247 376 375 240 228	581 552 219 219 358 358 505 505 52 52 120 120 572 543 11 725 725 24 24 283 283 299 299 14 14 76 76 245 245 20 520 497 369 353 112 107 3 3 36 91 503 482 1855 1774 620 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 926 275 262 272 259 184 175 36 34 307 292 337 321 545 519 175 126 120 61 58 0 0 27 26 15 14 89 85 295 281 0 2122 2122	681 552 219 219 358 358 505 505 52 52 120 120 572 543 11 11 725 725 24 24 283 283 299 299 14 14 76 76 245 245 20 20 520 497 369 353 112 107 3 3 96 91 503 482 1855 1774 620 593 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 926 885 275 262 272 259 184 175 36 34 307 292 337 321 545 519 175 167 126 120 61 58 0 0 27 26 15 14 89 85 295	681 552 219 219 358 358 505 505 52 52 120 120 572 543 11 11 6613 725 725 24 24 283 283 299 299 14 14 76 76 245 245 20 20 3402 520 497 369 353 112 107 3 3 96 91 503 482 1855 1774 620 593 10248 2121 2026 2927 2796 1343 1340 219 209 1386 1319 3918 3743 10551 10078 926 885 6260 275 262 272 259 184 175 36 34 307 292 337 321 545 519 175 167 9995 126 120 61 58 0 0 27 2







Sales & operations tools with LP/MIP

Detailed forecasts generation (monthly)

- Samples of fictive partial vehicles
- Product Mix objectives (versions, options)
 - ✓ Quadratic MIP with barrier

Distribution of production capacities between countries (monthly)

- Invoice deadlines (June and Dec)
- Sales targets
- Transportation capacities
 - ✓ Multi-objective optimization (LP and goal programming)

Production planning of show-room vehicles (on request)

- Production ramp-up
- Transportation capacities
- Countries demand (volume and timing)
 - ✓ Multi-objective optimization (MIP)







Workforce scheduling in paint shop (on request)



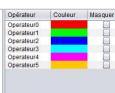






Operators' movements

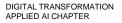












Holes assignement to operators

	Operateur0	Operateur1	Operateur2	Operateur3	Operateur4	Operateur5
Temps total (cmin)	143,12	181,19	154,97	161,39	162,49	111,83
TEP FOS A (cmin)	35,00	29,50	36,50	40,50	36,00	29,50
MIO (cmin)	24,00	24,00	28,00	28,00	28,00	20,00
OA int blocs (cmin)	11,16	34,75	10,23	10,54	15,05	6,12
DA ext blocs (cmin)	65,63	82,15	70,89	73,19	73,55	51,21
nb blocs	1	1	1	1	1	1
nb buses	7	7	8	8	8	6
nb trous	8	7	8	9	8	7
able buses	(0.0,0.0)	(0.0,0.0)	(0.0,15.0)	(0.0,15.0)	(0.0,0.0)	(0.0,0.0)
Taux engagement	76,53	96,89	82,87	86,30	86,89	59,80
	Trou734 [Buse59 Bloc1]	Trou736 [Buse60 Bloc2]	Trou735 [Buse62 Bloc2]	Trou701 [Buse189 Bloc2]	Trou700 [Buse188 Bloc1]	Trou789 [Buse225 Bloc1]
	Trou710 [Buse136 Bloc1]	Trou748 [Buse101 Bloc2]	Trou707 [Buse30 Bloc2]	Trou711 [Buse83 Bloc2]	Trou747 [Buse102 Bloc1]	Trou318 [Buse178 Bloc1]
	Trou757 [Buse136 Bloc1]	Trou110 [Buse110 Bloc2]	Trou758 [Buse135 Bloc2]	Trou725 [Buse40 Bloc2]	Trou706 [Buse81 Bloc1]	Trou305 [Buse165 Bloc1]
	Trou724 [Buse35 Bloc1]	Trou122 [Buse85 Bloc2]	Trou729 [Buse41 Bloc2]	Trou319 [Buse179 Bloc2]	Trou728 [Buse36 Bloc1]	Trou121 [Buse84 Bloc1]
	Trou109 [Buse109 Bloc1]	Trou21 [Buse21 Bloc2]	Trou738 [Buse42 Bloc2]	Trou306 [Buse166 Bloc2]	Trou737 [Buse37 Bloc1]	Trou320 [Buse180 Bloc1]
	Trou323 [Buse183 Bloc1]	Trou79 [Buse79 Bloc2]	Trou324 [Buse184 Bloc2]	Trou58 [Buse58 Bloc2]	Trou739 [Buse39 Bloc1]	Trou732 [Buse100 Bloc1]
	Trou20 [Buse20 Bloc1]	Trou744 [Buse200 Bloc2]	Trou321 [Buse181 Bloc2]	Trou740 [Buse43 Bloc2]	Trou78 [Buse78 Bloc1]	Trou755 [Buse100 Bloc1]
	Trou22 [Buse22 Bloc1]		Trou24 [Buse24 Bloc2]	Trou733 [Buse170 Bloc2]	Trou743 [Buse201 Bloc1]	
				Trou756 [Buse170 Bloc2]		

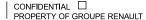
Column generation method





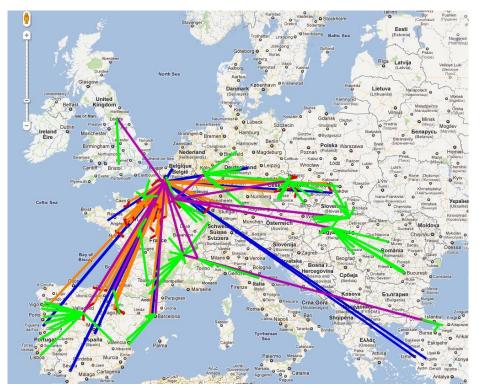






Network design for inbound flows (on request)

Routes towards Douai's plant (direct, milk-runs, x-dock)



Milk-runs













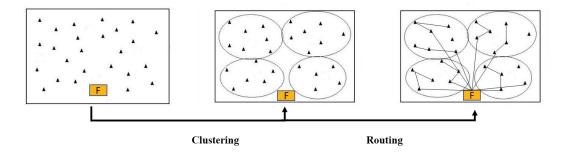




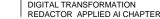


Optimization methods

- 1. Clustering: Partition of suppliers into clusters,
- 2. Routing: Identification of Direct and Indirect flows (MIP per cluster, MIP master problem)
- 3. Scheduling: Routes Assignment to weekdays (MIP).

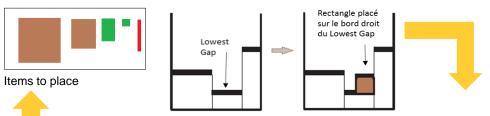






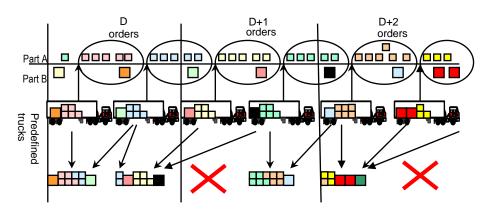
Trucks loading and orders anticipation (daily)

2D placement of items in the trucks with best fit heuristics



Build stacks and anticipate orders so as to maximize trucks filling rate

Construction heuristics + local search

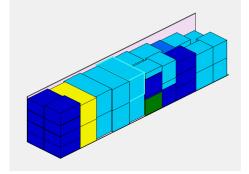


3000 trucks / week - 7 weeks horizon / GCP





Visualization of trucks





Production volumes distribution What-if scenario



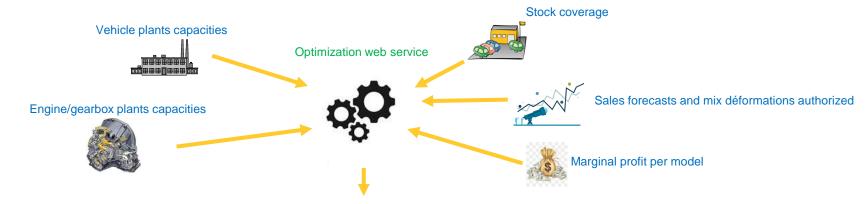


Distribution of engine volumes between models ?



MIP optimization

- Min constraints
- Min/max satisfaction



Volumes distribution which maximizes total profit





Q & A



