Goal Programming An Analysis of Multiple-Objective Optimization

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- We have assumed so far that **linear programming** encompasses a **single overriding objective** (e.g. maximizing total profit / minimizing total cost).
- Most times this is not realistic since we frequently focus on a variety of objectives, e.g. forest management:
 - to maintain stable profit,
 - increase wood production,
 - diversify ecosystem services,
 - restrain the impact of pests /diseases,
 - minimize erosion,

Goal programming

provides a way of achieving several objectives simultaneously.

• ...

Capacity limits we cannot change (e.g. number of seats on a flight) or we do not want to change

• Linear programming

Most LP problems have hard constraints that cannot be violated:

Max: $Z = 90 x_1 + 120 x_2$

Subject to:

and

	X ₁	≤ 40	(ha of pine)
		$x_2 \le 50$	(ha of eucalypt)
	2x ₁ + 3	$x_2 \le 180$	(days of work)
nd	$x_1 \ge 0;$	$x_2 \ge 0$	

Constraints are very important because they refer to the amount of resources / capacity limits we face

First, we look at our limitations; Then, we think of an optimization model

• Linear programming

Most LP problems have hard constraints that cannot be violated:

Max: $Z = 90 x_1 + 120 x_2$

Subject to:

X ₁	≤ 40	(ha of pine)
	$x_2 \le 50$	(ha of eucalypt)
2x ₁ + 3	$x_2 \le 180$	(days of work)

and $x_1 \ge 0; \quad x_2 \ge 0$

• Goal programming

GP problems have **soft constraints** that represent goals or targets we want to achieve

Suppose we look back to the Poets problem again and he says that he reconsidered and would be:

"... willing to give an extra 250 days of work if needed... preferred having 40 and 50 ha of pine and eucalypt but he would be flexible "

The "days of work" would no longer be a hard constraint

- The basic approach of **goal programming** is to:
 - 1) establish a specific numeric goal for each of the objectives
 - 2) formulate an objective function for each objective
 - 3) seek a solution that minimizes the (weighted) sum of deviations of these objective functions from their respective goals

There are three possible types of goals:

- A lower, one-sided goal sets a *lower limit* that we do not want to fall under (but exceeding the limit is fine).
- An **upper, one-sided goal** sets an *upper limit* that we do not want to exceed (but falling under the limit is fine).
- A **two-sided goal** sets a *specific target* that we do not want to miss on either side.

- Goal programming problems can be categorized according to the type of mathematical programming model that it fits except for having multiple goals instead of a single objective:
 - linear programming,
 - integer programming,
 - nonlinear programming,
 - etc

In class, we ill only consider **linear goal programming**—those goal programming problems that fit linear programming, but I'll refer to it just as **goal programming**

- Goal programming problems can also be categorized according to how the goals compare in importance:
- nonpreemptive goal programming if all the goals are of roughly comparable in importance
- preemptive goal programming if there is a <u>hierarchy of priority</u> <u>levels for the goals</u>, so that the goals of primary importance receive first priority attention, those of secondary importance receive second-priority attention, and so forth (if there are more than two priority levels).

The OR department of the DEWRIGHT COMPANY has been assigned the task of determining which mix of products should be produced.

Management wants primary consideration given to the following three goals:

(1) achieving a long-run profit (NPV) of at least \$125 million from these products

(2) maintaining the current employment level of 4,000 employees,

(3) holding the capital investment to less than \$55 million.

However, it probably will not be possible to attain all these goals simultaneously, priorities have been discussed leading to setting a *penalty weight:*

- 1) 5 for missing the profit goal (per \$1 million under),
- 2) 2 for going over the employment goal (per 100 employees) and 4 for going under this same goal
- 3) 3 for exceeding the capital investment goal (per \$1 million over)

Each new product's contribution to profit, employment level, and capital investment level is *proportional* to the rate of production.

These contributions per unit rate of production are shown in the table along with the goals and penalty weights.

Unit	Contrib	ution		
I	Product	:		Donalty
1	2	3	Goal (Units)	Weight
12 5 5	9 3 7	15 4 8	 ≥ 125 (millions of dollars) = 40 (hundreds of employees) ≤ 55 (millions of dollars) 	5 2(+), 4(-) 3
	Unit 1 12 5 5	Unit Contrib Product 1 2 12 9 5 3 5 7	Unit Contribution Product: 1 2 3 12 9 15 5 3 4 5 7 8	Unit ContributionProduct:123Goal (Units)12915 \geq 125 (millions of dollars)534 $=$ 40 (hundreds of employees)578 \leq 55 (millions of dollars)

Goal Programming Formulation: The Dewright Company problem includes all three possible types of **goals**:

- profit goal is a lower one-sided goal:
- employment goal is a two-sided goal:
- investment goal is an upper one-sided goal: $5x_1 + 7x_2 + 8x_3 \le 55$

 $12x_1 + 9x_2 + 15x_3 \ge 125$

 $5x_1 + 3x_2 + 4x_3 = 40$

Where x_1, x_2, x_3 are the decision variables representing the production rates of products 1, 2, and 3, respectively and $x_1, x_2, x_3 \ge 0$

Linear Programming Formulation: Transform goals into constraints

• Subject to:

 $12x_1 + 9x_2 + 15x_3 \ge 125$ $5x_1 + 3x_2 + 4x_3 = 40$ $5x_1 + 7x_2 + 8x_3 \le 55$

• Objective function:

The objective then is to choose the values of x_1 , x_2 , and x_3 that minimize

Z = 5(amount under the long-run profit goal)
+ 2(amount over the employment level goal)
+ 4(amount under the employment level goal)
+ 3(amount over the capital investment goal)

where no penalties are incurred for being over the long-run profit goal or for being under the capital investment goal

Maybe we can't satisfy all goals, but we want to capture how much we can satisfy (find the deviations)

Linear Programming Formulation:

To express this mathematically, we introduce some *auxiliary variables* y_1 , y_2 , and y_3 , to represent the deviations defined as follows:

 $y_1 = 12x_1 + 9x_2 + 15x_3 - 125$ (long-run **profit** minus the target) $y_2 = 5x_1 + 3x_2 + 4x_3 - 40$ (**employment** level minus the target) $y_3 = 5x_1 + 7x_2 + 8x_3 - 55$ (capital **investment** minus the target)

Since each y_i can be either positive or negative, and replace each one by the difference of two nonnegative variables:

 $y_{1} = y_{1}^{+} - y_{1}^{-}, \quad \text{where } y_{1}^{+} \ge 0, y_{1}^{-} \ge 0$ $y_{2} = y_{2}^{+} - y_{2}^{-}, \quad \text{where } y_{2}^{+} \ge 0, y_{2}^{-} \ge 0$ $y_{3} = y_{3}^{+} - y_{3}^{-}, \quad \text{where } y_{3}^{+} \ge 0, y_{3}^{-} \ge 0$

 y_i^+ represents the positive part of y_i variable (positive deviation) y_i^- represents the negative part of y_i variable (negative deviation)

Linear Programming Formulation:

Subject to:

If we're above 125, we have a positive deviation y_1^+ , but it's according to the goal, so there is no problem. However, we don't want to have a negative deviation, so we penalize y_1^-



Now we have a legitimate objective function for a linear programming model:

Min $Z = 5y_1^{-} + 2y_2^{+} + 4y_2^{-} + 3y_3^{+}$

Because there is no penalty for exceeding the profit goal of 125 or being under the investment goal of 55, neither y_1^+ nor y_3^- should appear in this objective function representing the total penalty for deviations from the goals.

Linear Programming Formulation:



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Min $Z = 5y_1^{-} + 2y_2^{+} + 4y_2^{-} + 3y_3^{+}$

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Linear Programming Formulation:



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Linear Programming Formulation:

Finally, we must incorporate the above definitions of the y_i^+ and y_i^- directly into the model, because the simplex method considers only the objective function and constraints that constitute the model.

For example, since $y_1^+ - y_1^- = y_1$, the above expression for y_1 gives

$$12x_1 + 9x_2 + 15x_3 - 125 = y_1^+ - y_1^-$$

After we move the variables $(y_1^+ - y_1^-)$ to the left-hand side and the constant (125) to the right-hand side,

$$12x_1 + 9x_2 + 15x_3 - (y_1^+ - y_1^-) = 125$$

becomes a legitimate equality constraint for a linear programming model.

Linear Programming Formulation:

Proceeding in the same way for $y_2^+ - y_2^-$ and $y_3^+ - y_3^-$, we obtain the following formulation for this goal programming problem

• Objective function:

Min
$$Z = 5y_1^{-} + 2y_2^{+} + 4y_2^{-} + 3y_3^{+}$$

• Subject to:

$$12x_{1} + 9x_{2} + 15x_{3} - (y_{1}^{+} - y_{1}^{-}) = 125$$

$$5x_{1} + 3x_{2} + 4x_{3} - (y_{2}^{+} - y_{2}^{-}) = 40$$

$$5x_{1} + 7x_{2} + 8x_{3} - (y_{3}^{+} - y_{3}^{-}) = 55$$

$$x_{1}, x_{2}, x_{3}, y_{1}^{+}, y_{1}^{-}, y_{2}^{+}, y_{2}^{-}, y_{3}^{+}, y_{3}^{-} \ge 0$$

In the preceding example we assume that all the goals are of roughly comparable importance.

Now consider the case of *preemptive* goal programming, where there is a **hierarchy of priority levels for the goals**. Such a case arises when one or more of the goals clearly are far more important than the others.

Thus, the initial focus should be on achieving as closely as possible these *first-priority* goals, while the other goals might divide into *second-priority* goals, *third-priority* goals, and so on.

After we find an optimal solution with respect to the *first-priority* goals, we can break any ties for the optimal solution by considering the *second-priority* goals. Any ties that remain after this reoptimization can be broken by considering the *third-priority* goals, and so on.

Excel Solver:

Applying the simplex method to this formulation yields an optimal solution with:

$$x_1 = 23/5$$
, $x_2 = 0$, $x_3 = 5/3$
 $y_1^+= 0$, $y_1^-= 0$, $y_2^+= 23/5$, $y_2^-= 0$, $y_3^+= 0$, $y_3^-= 0$

Therefore, $y_1 = 0$, $y_2 = 23/5$, and $y_3 = 0$, so the first and third goals are fully satisfied, but the employment level goal of 40 is exceeded by 8 1/3 (833 employees). The resulting penalty for deviating from the goals is Z = 16 2/3.

	x1, x2, x3 are the production rates of products 1, 2, and 3, respectively											
	Goals	x1	x2	х3	y1+	y1-	y2+	y2-	y3+	уЗ-	total	RHS
$12x_1 + 9x_2 + 15x_3 - (y_1^+ - y_1^-) = 125$	profit	12	9	15	-1	1	0	0	0	0	0	125
$5x_1 + 3x_2 + 4x_3 - (y_2^+ - y_2^-) = 40$	employment	5	3	4	0	0	-1	1	0	0	0	40
$5x_1 + 7x_2 + 8x_3 - (y_3^+ - y_3^-) = 55$	investment	5	7	8	0	0	0	0	-1	1	0	55
$x_1, x_2, x_3, y_1^+, y_1, y_2^+, y_2^-, y_3^+, y_3^- \ge 0$	lower bounds:	0	0	0	0	0	0	0	0	0		
decis	sion variables:	0	0	0	0	0	0	0	0	0		
Min $Z = 5y_1 + 2y_2^+ + 4y_2^- + 3y_3^+$ Pe	nalty weights:				0	5	2	4	3	0		
					num	ber of	penalt	y poin	ts incu	rred		
						by n	nissing	the g	oals			
	Min z=	0										





Excel Solver:

	x1, x2, x3 are t	the pro	oductio	on rate	es of pi	roduct	s 1, 2, i	and 3,	respec	ctively			
	Goals	x1	x2	x3	y1+	y1-	y2+	y2-	y3+	y3-	total	RHS	
	profit	12	9	15	-1	1	0	0	0	0	0	125	
	employment	5	3	4	0	0	-1	1	0	0	0	40	
	investment	5	7	8	0	0	0	0	-1	1	0	55	
)	ower bounds:	0	0	0	0	0	0	0	0	0			
decis	ion variables:	0	0	0	0	0	0	0	0	0			
Pe	nalty weights:				0	5	2	4	3	0			
					numl	ber of	penalt	y poin	ts incu	rred			
						by n	nissing	the g	oals				
	Min z=	0											

× Solver Parameters 1 Set Objective: **SGS15** 0 To: Min O Max O Value Of: By Changing Variable Cells: • \$G\$10:\$O\$10 Subject to the Constraints: \$G\$10:\$O\$10 > = \$G\$8:\$O\$8 <u>A</u>dd \$P\$4:\$P\$6 = \$Q\$4:\$Q\$6 Change Delete Reset All Load/Save Make Unconstrained Variables Non-Negative Select a Solving Simplex LP Options Method:

Excel Solver:

	x1, x2, x3 are t	tively											
	Goals	x1	x2	x3	y1+	y1-	y2+	y2-	y3+	y3-	total	RHS	
	profit	12	9	15	-1	1	0	0	0	0	0	125	
	employment	5	3	4	0	0	-1	1	0	0	0	40	
	investment	5	7	8	0	0	0	0	-1	1	0	55	
)	ower bounds:	0	0	0	0	0	0	0	0	0			
decis	ion variables:	0	0	0	0	0	0	0	0	0			
Pe	nalty weights:				0	5	2	4	3	0			
					numl	ber of	penalt	y poin	ts incu	rred			
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	Min z=	0											

× Solver Parameters • Set Objective: **SGS15** 0 To: Min O Max O Value Of: By Changing Variable Cells: • \$G\$10:\$O\$10 Subject to the Constraints: \$G\$10:\$O\$10 > = \$G\$8:\$O\$8 <u>A</u>dd \$P\$4:\$P\$6 = \$Q\$4:\$Q\$6 Change Delete Reset All Load/Save Make Unconstrained Variables Non-Negative Select a Solving Simplex LP Options Method:

Excel Solver:

	x1, x2, x3 are t	ctively											
	Goals	x1	x2	x3	y1+	y1-	y2+	y2-	y3+	y3-	total	RHS	
	profit	12	9	15	-1	1	0	0	0	0	0	125	
	employment	5	3	4	0	0	-1	1	0	0	0	40	
	investment	5	7	8	0	0	0	0	-1	1	0	55	
)	ower bounds:	0	0	0	0	0	0	0	0	0			
decis	sion variables:	0	0	0	0	0	0	0	0	0			
Pe	nalty weights:				0	5	2	4	3	0			
					num	ber of	penalt	y poin	ts incu	rred			
						by n	nissing	the g	oals				
	Min z=	0											

× Solver Parameters • Set Objective: **SGS15** 0 To: Min O Max O Value Of: By Changing Variable Cells: • \$G\$10:\$O\$10 Subject to the Constraints: \$G\$10:\$O\$10 > = \$G\$8:\$O\$8 <u>A</u>dd SPS4:SPS6 = SQS4:SQS6Change Delete Reset All Load/Save Make Unconstrained Variables Non-Negative Select a Solving Simplex LP Options Method:

	x1, x2, x3 are t												
	Goals	x1	x2	x3	y1+	y1-	y2+	y2-	y3+	y3-	total	RHS	1
	profit	12	9	15	-1	1	0	0	0	0	0	125	
	employment	5	3	4	0	0	-1	1	0	0	0	40	
	investment	5	7	8	0	0	0	0	-1	1	0	55	
													1
)	ower bounds:	0	0	0	0	0	0	0	0	0			
decis	ion variables:	0	0	0	0	0	0	0	0	0]		
Pe	nalty weights:				0	5	2	4	3	0			
					numl	ber of	penalt	y poin	ts incu	rred			
						by n	nissing	the g	oals				
	Min z=	0											

Se <u>t</u> Ob	jective:		SGS15		8
To:	○ <u>M</u> ax	Min	○ <u>V</u> alue Of:	0	
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	x1, x2, x3 are the production rates of products 1, 2, and 3, respectively												
	Goals	x1	x2	x3	y1+	y1-	y2+	y2-	y3+	y3-	total	RHS	
$12x_1 + 9x_2 + 15x_3 - (y_1^+ - y_1^-) = 125$	profit	12	9	15	-1	1	0	0	0	0	125	125	
$5x_1 + 3x_2 + 4x_3 - (y_2^+ - y_2^-) = 40$	employment	5	3	4	0	0	-1	1	0	0	40	40	
$5x_1 + 7x_2 + 8x_3 - (y_3^+ - y_3^-) = 55$	investment	5	7	8	0	0	0	0	-1	1	55	55	
$x_1, x_2, x_3, y_1^+, y_1^-, y_2^+, y_2^-, y_3^+, y_3^- \ge 0$	lower bounds:	0	0	0	0	0	0	0	0	0			
deci	sion variables:	8.33	0	1.67	0	0	8.33	0	0	0			
Min $Z = 5y_1^{+} + 2y_2^{+} + 4y_2^{-} + 3y_3^{+}$ Pe	nalty weights:				0	5	2	4	3	0			
					num	ber of	penalt	y poin	ts incu	rred			
						by n	nissing	the g	oals				
	Min z=	16.7											

	x1, x2, x3 are	the pro	oductio	on rate	es of pi	roduct	s 1, 2,	and 3,	respec	ctively			
	Goals	x1	x2	x3	y1+	y1-	y2+	y2-	y3+	у3-	total	RHS	_
$12x_1 + 9x_2 + 15x_3 - (y_1^+ - y_1^-) =$	= 125 profit	12	9	15	-1	1	0	0	0	0	125	125	
$5x_1 + 3x_2 + 4x_3 - (y_2^+ - y_2^-) =$	= 40 employment	5	3	4	0	0	-1	1	0	0	40	40	
$5x_1 + 7x_2 + 8x_3 - (y_3^+ - y_3^-) =$	55 investment	5	7	8	0	0	0	0	-1	1	55	55	
									-				
$_{1}, x_{2}, x_{3}, y_{1}^{+}, y_{1}^{-}, y_{2}^{+}, y_{2}^{-}, y_{3}^{+}, y_{1}^{-}, y_{2}^{+}, y_{2}^{-}, y_{3}^{+}, y_{2}^{-}, y_{3}^{+}, y_{2}^{-}, y_{3}^{+}, y_{3}^{-}, y_{3}^{+}, $	$_{3}^{2} \geq 0$ lower bounds:	0	0	0	0	0	0	0	0	0		This m	ายลทร
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	decision variables:	8.33	0	1.67	0	0	8.33	0	0	0	e g	goal of	40 h
Min $Z = 5y_1^{-} + 2y_2^{+} + 4y_2^{-} + 3y_3^{+}$	Penalty weights:				0	5	2	4	3	0		e	emplo
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						by r	nissing	the g	oals				
	Min z=	6.7											

	x1, x2, x3 are	e the pr	oducti	on rate	es of p	roduct	rs 1, 2, i	and 3,	respe	ctively			
	Goals	x1	x2	x3	y1+	y1-	y2+	y2-	y3+	у3-	total	RHS	
$12x_1 + 9x_2 + 15x_3 - (y_1^+ - y_1^-)$) = 125 profit	12	9	15	-1	1	0	0	0	0	125	125	
$5x_1 + 3x_2 + 4x_3 - (y_2^+ - y_2^-)$) = 40 employmen	t 5	3	4	0	0	-1	1	0	0	40	40	
$5x_1 + 7x_2 + 8x_3 - (y_3^+ - y_3^-)$	= 55 investment	5	7	8	0	0	0	0	-1	1	55	55	
$x_1, x_2, x_3, y_1^+, y_1, y_2^+, y_2^-, y_3^+,$	$y_3 \ge 0$ lower bounds	: 0	0	0	0	0	0	0	0	0	Т	his m	eans the best way
												to a	chieve the goals
	decision variables	: 8.33	0	1.67	0	0	8.33	0	0	0	<u>۽</u> ا	given	these penalties is
												not p	roducing product
Min $Z = 5y_1^2 + 2y_2^2 + 4y_2^2 + 3y_3^2$	Penalty weights	:			0	5	2	4	3	0			X ₂
					num	ber of	penalt	y poin	ts incu	rred			
						by r	nissing	the g	oals				
	Min z	= 16.7	,										

Exercise 1:

A project manager wants to find the quantities of 3 products. Producing 1 unit of:

- product 1 requires 40 employees, 2 tons of raw material and will bring the company a profit of 5 hundred €
- product 2 requires **30 employees**, **4 tons of raw material** and will bring the company a **profit of 8 hundred €**
- product 3 requires **20 employees**, **3 tons of raw material** and will bring the company a **profit of 4 hundred €**

The manager has 3 goals:

- 1) The maximum number of employees that can be allocated to producing these 3 products is <u>100 employees</u>
- 2) There are <u>10 tons of raw material</u> in the warehouse and he wants to consume no more no less than that
- 3) The total profit is expected to be <u>at least 30 hundred €</u>

The manager suspects he might not be able to meet these 3 goals simultaneously therefore he sets some penalty weights to each of the goals:

- Each extra employee is associated to a penalty of 5
- Each ton below the goal is associated to a penalty of 8 (-) whereas each ton above the goal of 10 is associated to a
 penalty of 12 (+)
- If profit is less than 30 hundred €, each hundred € is associated to a penalty of 15

Formulate the problem as a linear programming problem and use excel solver (LP simplex) to find the combination of the 3 products that minimizes the penalties.

Exercise 2:

Reconsider the original version of the Dewright Co. After further reflection about the solution obtained by the simplex method, management now is asking some what-if questions.

(a) Management wonders what would happen if the penalty weights in the rightmost column of Table 7.5 were to be changed to 7, 4, 1, and 3, respectively. Would you expect the optimal solution to change? Why?

(b) Management is wondering what would happen if the total profit goal were to be increased to wanting at least \$140 million (without any change in the original penalty weights). Solve the revised model with this change.

(c) Solve the revised model if both changes are made.

Exercise 2:

	Unit Contribution Product:					
					Penalty	
Factor	1	2	3	Goal (Units)	Weight	
Long-run profit	12	9	15	≥ 125 (millions of dollars)	5	
Employment level	5	3	4 8	= 40 (hundreds of employees) < 55 (millions of dollars)	2(+), 4(-)	
capital investment	,	,				

- penalty weights in the rightmost column of Table 7.5 were to be changed to 7, 4, 1, and 3, respectively.
- profit goal were to be increased to wanting at least \$140 million

- In *non-preemptive* GP we assume that all goals are of roughly comparable importance.
- HOWEVER, when one or more of the goals clearly are far more important than the others (*preemptive* GP), the initial focus should be on achieving as closely as possible these *first-priority* goals.
- The other goals also might naturally divide further into *second-priority* goals, *third-priority goals*, and so on.

When a hierarchy of priority levels for the goals is considered:

find an optimal		break any ties for the optimal		Remaining ties can be broken
solution with	Re-optimize	solution by	Re-optimize	by considering
for the		considering the		the
first-priority		second-priority		third-priority
goals		goals		goals

- When we deal with goals on the *same* priority level, our approach is just like the one described for non-preemptive goal programming.
- Any of the same three types of goals (lower one-sided, two-sided, upper one-sided) can arise.
- Different penalty weights for deviations from different goals still can be included, if desired.
- The same formulation technique of introducing auxiliary variables again is used to reformulate this portion of the problem to fit the linear programming format.

- There are two basic methods based on linear programming for solving preemptive goal programming problems:
 - sequential procedure
 - streamlined procedure

Let us illustrate these procedures by solving an exemple:

The Dewright Company has reconsidered the original formulation of the problem (summarized in the table) to face the recommendation to increase the company's workforce by more than 20 percent

	Unit Contribution				
	Product:		:		Penalty
Factor	1	2	3	Goal (Units)	Weight
Long-run profit	12	9	15	≥ 125 (millions of dollars)	5
Employment level	5	3	4	 = 40 (hundreds of employees) 	2(+), 4(-)
Capital investment	5	7	8	\leq 55 (millions of dollars)	3

This probably would be a temporary increase, so the very high cost of training 833 new employees would be largely wasted

Management has concluded that a very high priority should be placed on:

- avoiding an increase in the workforce.
- avoiding capital investment above \$55 million

Based on these considerations, a *preemptive goal programming* approach should now be used, where the first-priority goals should be:

- a very high priority should be placed on avoiding capital investment
- avoiding an increase in the workforce

and the other two original goals (the second priority goals):

- exceeding \$125 million in long-run profit
- avoiding a decrease in the employment level

Within the two priority levels, management feels that the relative penalty weights still should be the same as those given in the rightmost column of the table.

This reformulation is summarized below:

Priority Level	Factor	Goal	Penalty Weight
First priority	Employment level	≤40	2M
	Capital investment	≤55	3M
Second priority	Long-run profit	≥125	5
	Employment level	≥40	4

where a factor of *M* (representing a huge positive number) has been included in the penalty weights for the *first-priority* goals to emphasize that these goals preempt the *second-priority* goals.

The portions of the original table not included in this one remained unchanged

The Sequential Procedure

- The preemptive GP problem consists of solving a sequence of linear programming models.
- 1st stage —only the first-priority goals goals included in the linear programming model are considered
- 2nd stage the <u>simplex method is applied</u> in the usual way

If the resulting **optimal solution is** *unique*,

we adopt it immediately disregarding any additional goals. If there are *multiple* optimal solutions with the same optimal value of Z (call it Z^*),

we prepare to break the tie among these solutions by moving to the second stage and adding the secondpriority goals to the model.

At the first stage, only the two *first-priority* goals are included in the linear programming model. Therefore, we can drop the common factor *M* for their penalty weights.

By proceeding just as for the non-preemptive model if these were the only goals, the resulting linear programming model is

Minimize
$$Z = 2 y^{2^+} + 3 y^{3^+}$$

subject to:



And $xj \ge 0$, $yk^+ \ge 0$, $yk^- \ge 0$ (j = 1, 2, 3; k = 2, 3)

For ease of comparison with the non-preemptive model with all four goals, we have kept the same subscripts on the auxiliary variables.

By using the simplex method, an optimal solution for this linear programming model has $y2^+ = 0$ and $y3^+ = 0$, with Z = 0 (so $Z^* = 0$), because there are innumerable solutions for (x1, x2, x3) that satisfy the relationships

 $5x1 + 3x2 + 4x3 \le 40$ $5x1 + 7x2 + 8x3 \le 55$

as well as the non-negativity constraints.

Therefore, these two *first-priority goals* should be used as *constraints* hereafter.

Using them as constraints will force y^{2+} and y^{3+} to remain zero and thereby disappear from the model automatically.

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Using them as constraints will force y^{2+} and y^{3+} to remain zero and thereby disappear from the model automatically.

If we drop y2⁺ and y3⁺ but add the *second-priority goals*, the second-stage linear programming model becomes

Minimize $Z = 5y1^{-} + 4y2^{-}$

subject to:

$$12x1 + 9x2 + 15x3 - (y1^{+} - y1^{-}) = 125$$

$$5x1 + 3x2 + 4x3 + y2^{-} = 40$$

$$5x1 + 7x2 + 8x3 + y3^{-} = 55$$

$$y_{1}^{+}$$

$$y_{2}^{-}$$

$$y_{2}^{-}$$

And $xj \ge 0, y1 \ge 0, yk \ge 0$ (j = 1, 2, 3; k = 1, 2, 3)

Applying the simplex method to this model yields the unique optimal solution x1 = 5, x2 = 0, x3 = 3 3/4, $y1^+ = 0$, $y1^+ = 8$ 3/4, $y2^- = 0$, and $y3^- = 0$, with Z = 43 ³/₄.

Because this solution is unique (or because there are no more priority levels), the procedure can now stop, with (x1, x2, x3) (5, 0, 3 3/4) as the optimal solution for the overall problem.

This solution fully achieves both *first-priority goals* as well as one of the second-priority goals (no decrease in employment level), and it falls short of the other *second-priority goal* (long-run profit 125) by just 8 3/4.





the *streamlined procedure*, instead of solving a sequence of linear programming models, finds an optimal solution by <u>solving just *one*</u> <u>linear programming model</u>.

Thus, the streamlined procedure is able to duplicate the work of the sequential procedure with just *one run* of the simplex method.

This one run *simultaneously* finds optimal solutions based just on *first-priority goals* and breaks ties among these solutions by considering lower-priority goals.

However, this does require a slight modification of the simplex method.

If there are just *two* priority levels, the modification of the simplex method consists of applying the **big M method**

In this form, instead of replacing *M* throughout the model by some huge positive number before running the simplex method, we retain the *symbolic* quantity *M* in the sequence of simplex tableaux.

Each coefficient in row 0 (for each iteration) is some linear function *aM+b*, where *a* is the current *multiplicative factor* and *b* is the current *additive term*.

The **usual decisions** based on these coefficients (entering basic variable and optimality now **are based solely on the** *multiplicative* factors, except that any <u>ties would be broken</u> by using the *additive* terms.

This is how the OR Courseware operates when solving interactively by the simplex method (and choosing the **Big M method**).

The LP formulation with two priority levels would:

- include *all* the goals in the model (in the usual manner),
- basic penalty weights of *M* assigned to deviations from first-priority goals
- basic penalty weights of 1 assigned to deviations from *second-priority* goals

If different penalty weights are desired within the same priority level, these basic penalty weights then are multiplied by the individual penalty weights assigned within the level.

Example:

For the goal programming problem summarized below, note that

- (1) different penalty weights are assigned within each of the two priority levels
- (2) the individual penalty weights (2 and 3) for the first-priority goals have been multiplied by M

Priority Level	Factor	Goal	Penalty Weight
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Second priority	Long-run profit	≥125	5
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Minimize $Z = 5y1^{-} + 2My2^{+} + 4y2^{-} + 3My3^{+}$,

subject to

$$12x1 + 9x2 + 15x3 - (y1^{+} - y1^{-}) = 125$$

$$5x1 + 3x2 + 4x3 - (y2^{+} - y2^{-}) = 40$$

$$5x1 + 7x2 + 8x3 - (y3^{+} - y3^{-}) = 55$$

And $xj \ge 0$, $yk \ge 0$, $yk \ge 0$ (j = 1, 2, 3; k = 1, 2, 3).

Because this model uses *M* to symbolize a huge positive number, the simplex method can be applied as described in previous classes.

Alternatively, a in the model and then any software pacvery large positive number can be substituted for M kage based on the simplex method can be applied.

Doing either naturally yields **the same unique optimal** solution obtained by the sequential procedure.

The LP formulation with more than two priority levels can be generalized in a straightforward way:

The basic penalty weights for the respective levels now are M1, M2, . . . , Mp-1, 1.

Where:

M1 represents a number that is vastly larger than M2, M2 is vastly larger than M3, . . . , and Mp-1 is vastly larger than 1.

Each coefficient in row 0 of each simplex tableau is now a linear function of all of these quantities, where the multiplicative factor of M1 is used to make the necessary decisions, with tie breakers beginning with the multiplicative factor of M2 and ending with the additive term.

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Conclusions:

Linear goal programming and its solution procedures provide an effective way of dealing with problems where management wishes to **strive toward several goals simultaneously**

The key is a formulation technique of introducing auxiliary variables that enable converting the problem into a linear programming format.

• If *Z*=*0

all the auxiliary variables representing the *deviations from first-priority goals* must equal zero (full achievement of these goals)

Thus, all these auxiliary variables now can be completely deleted from the model, where the equality constraints that contain these variables are replaced by the mathematical expressions (inequalities or equations) for these first-priority goals, to ensure that they continue to be fully achieved. • if *Z** > 0

the second-stage model simply adds the second-priority goals to the first-stage model (as if these additional goals actually were first-priority goals),

but then it also adds the constraint that the *first-stage objective function* equals Z* (which enables us again to delete the terms involving first-priority goals from the second-stage objective function).

After we apply the simplex method again, if there still are multiple optimal solutions, we repeat the same process for any lower priority goals.