

A Multi-Objective Decision Making Model for Remanufacture-To-Order System

Surendra M. Gupta

(with contributions from Aditi Joshi and Ammar Alqahtani)
Laboratory for Responsible Manufacturing (LRM)
Department of Mechanical and Industrial Engineering
Northeastern University
Boston, MA 02115, U.S.A.

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Background

- Rapid advancement in product technology has led to shorter product life cycles and premature disposal of products.
- This has resulted in the dramatic decrease of natural resources and an alarming decrease in the number of landfill sites.
- As a remedy for these problems, local governments are imposing stricter environmental regulations.
- In order to comply with these regulations, firms invest in environmentally conscious manufacturing in all phases in a product's life cycle (i.e., from conceptual design to end of life processing).
- They also set up specific facilities for product recovery.



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Product Recovery

- Product Recovery aims to minimize the amount of waste sent to landfills by recovering materials and parts from old or outdated products by means of recycling and remanufacturing (including reuse of parts and products)



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Reasons Companies get involved in Product Recovery

- Legislation
- Profitability
- Environmental concerns and sustainability



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Choices in Product Recovery

- **Recycling**
 - Definition: Recycling is the process of recovering the material content of end-of-life (EOL) products by performing the necessary disassembly, sorting and chemical operations
 - Identities of parts of EOL products are lost
- **Remanufacturing**
 - Definition: Remanufacturing is the process of performing the required disassembly, sorting, refurbishing and assembly operations in order to bring parts of an EOL product (or the entire product) to a desired level of quality
 - Identities of parts of EOL products are not lost



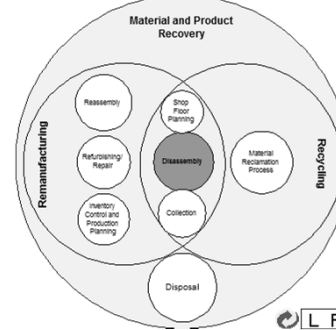
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Disassembly

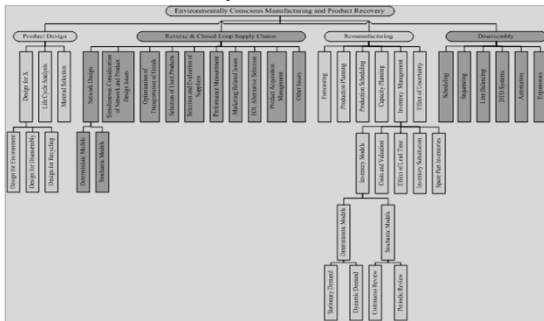
- **Definition:** Disassembly is a systematic method for separating a product into its constituent parts, components, subassemblies, or other groupings.
- It may be partial, i.e., product is not fully disassembled; or
- It may be complete, i.e., product is fully disassembled.
- It may be done destructively using operations such as cutting, and crushing etc.; or
- It may be carried-out non-destructively using operations such as un-screwing, and un-snapping etc.



Components of Product Recovery



Environmentally Conscious Manufacturing and Product Recovery Literature Classification



Multi Criteria Decision Making Techniques

- In order to solve the problems associated with environment conscious manufacturing and product recovery (ECMPRO), researchers have developed various algorithms, models, heuristics, and software.
- Among them, multi criteria decision making techniques have played an important part since those techniques can simultaneously consider more than one objective.
- Moreover, they are very good at modeling conflicting objectives, a common characteristic of ECMPRO issues (e.g., maximization of revenue from product recovery operations vs. minimization of environmental consequences of those operations).

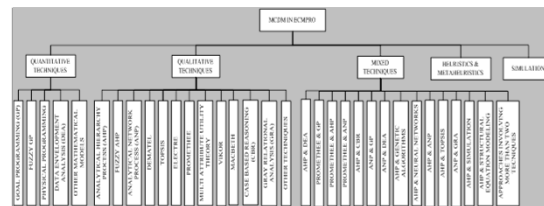


MCDM Techniques used in ECMPRO

- **Quantitative Techniques**
 - Goal Programming and Fuzzy Goal Programming
 - Physical Programming
 - Data Envelopment Analysis
- **Qualitative Techniques**
 - AHP, Fuzzy AHP, ANP
 - TOPSIS, ELECTRE, PROMETHEE, VIKOR, MACBETH, DEMATEL, Case Based Reasoning, Gray Relational Analysis
- **Mixed Techniques**
 - Integration of Two or More MCDM Techniques
- **Heuristic and Metaheuristic Techniques**
- **Simulation**



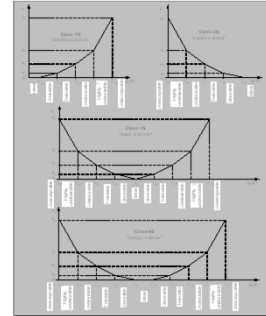
Classification of MCDM Techniques used to Solve ECMPRO Issues



Linear Physical Programming (LPP)

- LPP has the ability to avoid the weight assignment by providing a preference function.
- DM determines a suitable preference function and specifies ranges of different degrees of desirability (ideal, desirable, tolerable, undesirable, highly undesirable, and unacceptable) for each criterion. There are eight preference functions classified into 8 classes, 4 soft and 4 hard.

Linear Physical Programming



Remanufacturing-To-Order System

- RTO system disassembles, remanufactures and recycles EOL products to meet the products, components and materials demands.
- Outside procurement is considered to avoid back-orders.
- Disassembly can be destructive or non-destructive.
- All the data stored on EOL products is retrieved using sensor readers when they arrive at the product recovery facility.

LPP Model

- The objectives of the proposed RTO system are: minimizing the total cost, minimizing the disposal weight, maximizing the quality level and maximizing the material sales revenue. The system is formulated using LPP as follows:

- Objective Function
- The LP objective function is written as:

$$\min \phi = \sum_{u \in U} \sum_{s \in \{2,3,4,5\}} (\omega_{us}^+ d_{us}^+ + \omega_{us}^- d_{us}^-)$$

LPP Model (cont.)

- Smaller-is-better (Class 1-S):
- Total Cost (TC)(g1): Total cost is written as the sum of total disassembly cost (TDC), total remanufacturing cost (TRMC), total recycling cost (TRC), and total outside procurement cost (TOPC).

$$g_1 = TC = TDC + TRMC + TRC + TOPC$$

Where,

$$TDC = \sum_{i \in I} [x_i \sum_{j \in J} ((1 - el_{ij}) * a_{ij} cd_j + f_{ij} cb) + xd_i cb \sum_{j \in J} (a_{ij} + el_{ij})]$$

$$TRMC = \sum_{i,j \in J} [y_i cb (f_{ij} + el_{ij}) + cd_j \sum_{b \in B} r m_{ijb} + ca_j \sum_{t \in I, m \in M} y_{itm} (def_{itmj} + mis_{itm})]$$

LPP Model (cont.)

$$TRC = cr_j \sum_{j \in J} (rb_j + \sum_{b \in B} r_{jb})$$

$$TOPC = \sum_{j \in J, b \in B} c_{jb} l_{jb}$$

- Disposal Weight (DW) (g2): the disposal weight is given as:

$$g_2 = DW = \sum f_{ij} * (1 - PRC_j) * w_j$$

LPP Model (cont.)

- **Class2-S: Larger-is-better**
- **Quality level (Q) (g₃):** The quality level is given as:

$$g_3 = Q = \sum_{i \in I, j \in J, b \in B} a_{ij}(\beta - b)$$

- **Material sales revenue (MSR) (g₄):** The material sales revenue is given as:

$$g_4 = MSR = \sum_{k \in K} prc_k (dm_k + sm_k)$$



LPP Model (cont.)

- **System Constraints:**
- **All constraints of the system belong to hard classes.**

$$\bar{x}_i + x d_i + \bar{y}_i \leq 1 \quad \forall i$$

$$\sum_{b \in B} x_{ijb} = (1 - e_{ij}) a_{ij} \bar{x}_i \quad \forall i, j$$

$$\sum_{\{b \in B : c_{ijb} = 0\}} x_{ijb} = 0 \quad \forall i, j, b$$



LPP Model (cont.)

$$\sum_{t \in T, m \in M} y_{itm} = \bar{y}_i \quad \forall i$$

$$\sum_{i \in I} y_{itm} = d_{p_{tm}} \quad \forall t, m$$

$$\sum_{i \in I} [a_{ij} x_{ijb} + r m_{ijb} - \sum_{t \in T, m \in M} rep_{itmj} b] + l_{js} - r_{js} \quad \forall j, b$$

Where,

$$\sum_{\{b \in B : c_{ijb} = 0\}} r m_{ijb} = (1 - e_{ij}) \sum_{t \in T, m \in M} y_{itm} (def_{itmj} + ext_{itj}) \quad \forall i, j$$

$$\sum_{\{b \in B : c_{ijb} = 0\}} r m_{ijb} = 0 \quad \forall j, b$$



LPP Model (cont.)

$$\sum_{\{b \in B : b \geq 2m\}} rep_{itmj} b = y_{itm} (mis_{itj} + def_{itj}) \quad \forall i, j, t, m$$

$$\sum_{\{b \in B : b < m\}} rep_{itmj} b = 0 \quad \forall i, j, t, m$$

$$\sum_{i \in I} \gamma_{jk} (r b_j + \sum_{b \in B} r_{jb}) \geq d m_k \quad \forall k$$

$$\alpha \sum_{i \in I} (f_{ij} + e_{ij}) (\bar{x}_i + y_i) \leq r b_j \leq \sum_{i \in I} (f_{ij} + e_{ij}) (\bar{x}_i + y_i) \quad \forall j$$



Numerical Example

- **10 different configurations of the products are available and each configuration deals with 6-10 components.**
- **The quality level of a component is defined by the remaining life of that component.**
- **Based on this remaining life, components are divided into three life-bins.**
- **The first life-bin holds components whose remaining life is at least one year. The second life-bin holds components whose remaining life is at least three years. The third life-bin holds components with remaining life of five years or more.**
- **The components with remaining life of less than one year are treated as nonfunctional.**



Numerical Example (cont.)

Configurations of the Product types

| Product types | Components | | | | | | | | | |
|---------------|------------|---|---|---|---|---|---|---|---|----|
| | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| 1 | X | X | X | X | X | X | X | X | | |
| 2 | X | X | X | X | | | | | X | X |
| 3 | | | X | X | X | X | X | X | X | X |
| 4 | X | X | X | X | X | X | X | X | X | X |
| 5 | X | X | X | X | | | | | | X |
| 6 | X | X | | X | X | X | X | X | X | X |
| 7 | | X | X | X | X | X | X | X | X | X |
| 8 | X | X | X | X | | | | X | X | X |
| 9 | X | X | X | X | | | | X | X | X |
| 10 | X | | X | X | | | X | X | X | X |



Numerical Example (cont.)

Remaining lives of components

| EOL product | Components | | | | | | | | | |
|-------------|------------|------|------|------|------|------|------|------|------|------|
| | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| 1 | 4.35 | NF | 5.05 | 3.45 | - | - | - | 3.29 | 3.11 | 5.96 |
| 2 | 4.67 | 2.86 | - | 5.03 | 1.31 | 6.57 | NF | 3.38 | NF | 6.58 |
| 3 | 3.03 | 4.30 | 2.63 | 7.58 | - | - | - | - | NF | NF |
| . | . | . | . | . | . | . | . | . | . | . |
| . | . | . | . | . | . | . | . | . | . | . |
| . | . | . | . | . | . | . | . | . | . | . |
| 399 | 3.07 | 3.58 | 4.74 | NF | - | - | 4.88 | 4.07 | 1.75 | 4.62 |
| 400 | 3.15 | 3.99 | 6.01 | 2.43 | - | - | 3.64 | 5.27 | NF | 4.43 |

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Numerical Example (cont.)

Components Demands

| Component | Remaining Life Bins | | |
|-----------|---------------------|------|------|
| | Bin1 | Bin2 | Bin3 |
| 1 | 20 | 22 | 17 |
| 2 | 16 | 12 | 15 |
| 3 | 22 | 22 | 8 |
| 4 | 31 | 20 | 14 |
| 5 | 15 | 31 | 16 |
| 6 | 26 | 33 | 19 |
| 7 | 35 | 33 | 15 |
| 8 | 14 | 17 | 14 |
| 9 | 26 | 23 | 17 |
| 10 | 29 | 25 | 12 |

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Numerical Example (cont.)

Products Demands

| Product types | Remaining Life Bins | | |
|---------------|---------------------|------|------|
| | Bin1 | Bin2 | Bin3 |
| 1 | 6 | 4 | 8 |
| 2 | 6 | 4 | 10 |
| 3 | 12 | 10 | 8 |
| 4 | 12 | 2 | 8 |
| 5 | 10 | 0 | 6 |
| 6 | 2 | 6 | 8 |
| 7 | 10 | 8 | 10 |
| 8 | 6 | 10 | 12 |
| 9 | 6 | 6 | 8 |
| 10 | 4 | 10 | 8 |

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Numerical Example (cont.)

Procurement, disassembly, assembly, recycling costs and material yields

| Component | Procurement cost | | | Disassembly cost | Assembly cost | Recycling cost | Material A yield | Material B yield |
|-----------|------------------|------|------|------------------|---------------|----------------|------------------|------------------|
| | Bin1 | Bin2 | Bin3 | | | | | |
| 1 | 20 | 40 | 50 | 1.5 | 1.5 | 0.1 | 1 | 0 |
| 2 | 40 | 30 | 60 | 1.5 | 1.5 | 0.1 | 1 | 0 |
| 3 | 60 | 70 | 75 | 1.5 | 1.5 | 0.1 | 1 | 0 |
| 4 | 15 | 20 | 25 | 0.5 | 0.5 | 0.1 | 0 | 1.5 |
| 5 | 15 | 20 | 25 | 0.5 | 0.5 | 0.1 | 0 | 1.5 |
| 6 | 15 | 20 | 25 | 0.5 | 0.5 | 0.1 | 0 | 1.5 |
| 7 | 12 | 18 | 24 | 2 | 2 | 0.2 | 1.5 | 0 |
| 8 | 18 | 22 | 26 | 2 | 2 | 0.2 | 1.5 | 0 |
| 9 | 22 | 24 | 30 | 2 | 2 | 0.2 | 1.5 | 0 |
| 10 | 24 | 30 | 32 | 2 | 2 | 0.2 | 1.5 | 0 |

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Numerical Example (cont.)

Desirable ranges for each criterion

| | Total Cost | Disposal Weight | Quality Level | Material Sales Revenue |
|--------------------|-------------|-----------------|---------------|------------------------|
| Ideal | ≤5900 | ≤0 | ≥1990 | ≥6500 |
| Desirable | (5900,6200] | (0,21] | [1850,1990) | [5400,6500) |
| Tolerable | (6200,7100] | (21,35] | [1200,1850) | [4200,5500) |
| Undesirable | (7100,8000] | (35,49] | [700,1200) | [2900,4200) |
| Highly Undesirable | (8000,9500] | (49,65] | [0,700) | [2300,2900) |
| Unacceptable | >9500 | >65 | <0 | <2300 |

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Results

- Linear physical programming weight (LPPW) algorithm was coded and run using MATLAB.
- Using the weights calculated, the mathematical model was constructed and solved using LINGO 13.0.
- 170 EOL products were disassembled to meet the components demands, 15 EOL products were disassembled destructively to obtain parts for recycling, 200 EOL products were remanufactured to meet the products demands and rest were left untouched.

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Results (cont.)

Quality level bin in which disassembled components are placed

| EOL product | Components | | | | | | | | | |
|-------------|------------|---|---|---|---|---|---|---|---|----|
| | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| 1 | 1 | - | 3 | 2 | - | - | - | 2 | 1 | 3 |
| 2 | 1 | 1 | - | 3 | 1 | 3 | - | 2 | - | 3 |
| . | . | . | . | . | . | . | . | . | . | . |
| . | . | . | . | . | . | . | . | . | . | . |
| . | . | . | . | . | . | . | . | . | . | . |
| 398 | 1 | 1 | 2 | - | - | - | - | 3 | 3 | 2 |
| 400 | 2 | 2 | 3 | 1 | - | - | 2 | 3 | - | 1 |

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Results (cont.)

Product types and quality levels of remanufactured EOL products

| EOL product | Product type | Quality level |
|-------------|--------------|---------------|
| 4 | 1 | 2 |
| 6 | 3 | 3 |
| 7 | 8 | 3 |
| . | . | . |
| . | . | . |
| . | . | . |
| 395 | 5 | 3 |
| 399 | 4 | 1 |

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Results (cont.)

Aspiration levels and values of criteria

| Description | Aspiration levels | Value |
|------------------------|--------------------|---------|
| Total Cost | Desirable | 6050.13 |
| Disposal Weight | Highly Undesirable | 51.71 |
| Quality Level | Undesirable | 903 |
| Material Sales Revenue | Tolerable | 4623.89 |

The total cost fell under "Desirable" range, disposal weight under "Highly Undesirable" range, quality level under "Undesirable" range and material sales revenue under "Tolerable" range.

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Topical Areas of Some of Our Recent Work

- Design for Disassembly
- Disassembly Sequencing
- Disassembly-To-Order System
- Disassembly Line Balancing Problem
- Modified Kanban System for Disassembly
- Inventory Issues Stemming from Disassembly
- Optimal Buffer Allocation in Remanufacturing Systems
- Economic Analysis of US Automobile Recycling Infrastructure
- Strategic Planning Models for Reverse and Closed-Loop Supply Chains
- Sensors Embedded Products to Tackle Reverse Logistics Related Problems
- Solving Sequence-Dependent Disassembly Line Balancing Problem using Heuristics



Some of the Techniques Employed

- | | |
|-------------------------------|---|
| Analytic Hierarchy Process | Linear Integer Programming |
| Analytic Network Process | Linear Physical Programming |
| Bayesian Updating | Mathematical Programming |
| Borda's Choice Rule | Method of Total Preferences |
| Case-Based Reasoning | MRP Techniques |
| Cost-Benefit Function | Multi-Criteria Optimization |
| Digital Simulation | Neural Networks |
| Eigen Vector Method | Petri-Nets |
| Extent Analysis Method | Quality Function Deployment |
| Fuzzy Logic | Queueing Theory |
| Genetic Algorithm | Reliability Models |
| Goal Programming | Sensitivity Analysis |
| Graph Theory | Technique for Order Preference by Similarity to Ideal Solution (TOPSIS) |
| Heuristics and Metaheuristics | Theory of Constraints |
| JIT Philosophy | |



Additional Reading

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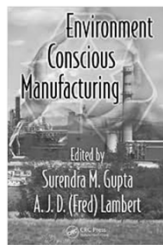
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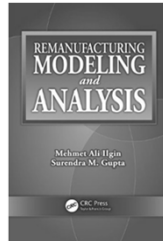
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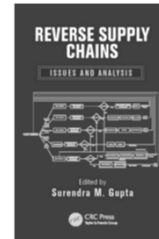
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Additional Reading (forthcoming)

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Contact Information

Dr. Surendra M. Gupta, P.E.

*Professor of Mechanical and Industrial Engineering and
Director of Laboratory for Responsible Manufacturing*

334 SN, Department of MIE
Northeastern University
360 Huntington Avenue
Boston, MA 02115, U.S.A.

(617)-373-4846 Phone
(617)-373-2921 Fax
gupta@neu.edu E-mail.

<http://www.coe.neu.edu/~smgupta/> Home Page

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