

Comprehensive College Ranking System: A DEA-ANP Hybrid Model

Executive Summary

Purpose

This analysis presents a **two-stage hybrid approach** for engineering college selection, combining Data Envelopment Analysis (DEA) and Analytic Network Process (ANP) to help 12th-grade students make informed decisions.

Key Metrics

- **Total Colleges Analyzed:** 30
- **Colleges Shortlisted:** 7
- **Criteria Clusters:** 5
- **Student Rank:** 4,312

Methodology Overview

Stage	Method	Purpose	Output
1	Data Envelopment Analysis (DEA)	Objective efficiency screening	Top 7 efficient colleges
2	Analytic Network Process (ANP)	Subjective preference ranking	Final prioritized list

This hybrid approach balances **objective performance metrics** with **subjective personal priorities**, ensuring both efficiency and student-fit alignment.

Methodology

Stage 1: Data Envelopment Analysis (DEA)

Model Specification

- **Model Type:** Input-Oriented CCR (Charnes-Cooper-Rhodes)
- **Objective:** Evaluate how efficiently colleges convert resources into outcomes
- **Efficiency Score Range:** 0 to 1 (where 1.0 = perfect efficiency)

Input Variables (5 metrics)

The DEA model evaluates the following resource inputs:

1. **Faculty FTE** - Full-time equivalent faculty count
2. **PhD Faculty Count** - Number of doctoral-qualified faculty
3. **Hostel Beds** - Residential capacity
4. **Infrastructure Score** - Quality of facilities and amenities
5. **Operating Expenditure** - Annual operational costs

Output Variables (6 metrics)

The model measures the following outcomes:

1. **Placement Rate** - Percentage of students placed
2. **Average Package** - Mean salary of placed students
3. **Research Publications** - Academic output per year
4. **Student Satisfaction** - Survey-based satisfaction index
5. **Graduation Rate** - Percentage completing degree on time
6. **Inverted Cutoff Rank** - Transformed selectivity metric

Efficiency Calculation

For each college j , the efficiency score θ_j is calculated as:

$$\theta_j = (\text{weighted sum of outputs}) / (\text{weighted sum of inputs})$$

where weights are optimized to maximize each college's efficiency score while keeping all scores ≤ 1 .

Selection Criteria

- Colleges with **$\theta=1.0$** are considered perfectly efficient
- Top 7 **efficient colleges** were shortlisted for Stage 2 analysis

Stage 2: Analytic Network Process (ANP)

Overview

ANP evaluates shortlisted colleges based on **5 interdependent criteria clusters** with consideration of internal dependencies and feedback loops.

Criteria Clusters and Weights

Cluster	Weight	Sub-Criteria
Logistics	7.9%	Distance from home, Travel time, Hostel availability
Academic	24.4%	Branch availability, Faculty-student ratio, Curriculum relevance, Rank fit score
Financial	13.7%	Total fee per year, Scholarship availability, Fee flexibility
Campus Life	13.7%	Campus safety, Extracurricular activities, Health facilities
Reputation	40.3%	Alumni network, Industry connections, Accreditations

ANP Process

- 1. Pairwise Comparison Matrices:** Experts/students compare criteria importance using Saaty's 1-9 scale
- 2. Supermatrix Construction:** Build unweighted, weighted, and limit supermatrices
- 3. Principal Eigenvector Method:** Extract priority vectors from each matrix
- 4. Interdependency Analysis:** Account for feedback between criteria
- 5. Final Priority Calculation:** Compute overall college priorities

Consistency Validation

- Consistency Ratio (CR)** calculated for all pairwise comparison matrices
- Acceptable threshold:** CR < 0.10
- Warns users if judgments are inconsistent and require revision

Results and Findings

DEA Stage Results

Efficiency Distribution

- 10 out of 30 colleges** achieved perfect efficiency ($\theta = 1.0$)
- Mix of large and medium-sized institutions represented
- All shortlisted colleges demonstrate optimal resource utilization

Top 7 Shortlisted Colleges

Rank	College ID	Efficiency Score	Size Category
-	C24	1.0000	Large
-	C14	1.0000	Medium
-	C29	1.0000	Large
-	C28	1.0000	Medium
-	C10	1.0000	Medium
-	C9	1.0000	Large
-	C2	1.0000	Medium

Note: All 7 colleges are equally efficient in DEA; ranking determined in ANP stage.

ANP Stage Rankings

Final Priority Scores

Rank	College	Priority Score	Key Strengths
1	C29	0.1542	Strong financial position, excellent campus facilities
2	C24	0.1531	Best logistics (closest to home), good reputation
3	C14	0.1481	Excellent campus life, strong academics
4	C28	0.1448	Balanced across all criteria
5	C10	0.1421	Best rank fit (cutoff: 35,453)
6	C9	0.1394	Strong reputation and industry ties
7	C2	0.1183	Good academic programs

Student Rank Context

- **Student Rank:** 4,312
 - **Best Rank Fit:** C10 (cutoff rank: 35,453)
 - **Rank Safety Margin:** 31,141 ranks below cutoff
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Future Enhancements

Data Integration

- **Real College Data:** Fetch from NIRF, JoSAA, college websites
- **Live Updates:** Current cutoff ranks, placement rates, fees
- **Historical Trends:** 3-5 year trends for placement and cutoffs

Advanced Analytics

- **Cross-Validation:** Compare with TOPSIS, PROMETHEE, pure AHP
- **Monte Carlo Simulation:** Test robustness under input uncertainty
- **Machine Learning:** Train on past student choices to refine weights
- **Confidence Intervals:** Provide uncertainty bands around scores

User Experience

- **Comparison View:** Side-by-side college comparison with radar charts
- **Export Reports:** Generate PDF reports with detailed breakdowns

Constraint Handling

- **Budget Constraints:** Hard filter for maximum affordable fees
- **Geographic Preferences:** Distance/state/region filters
- **Branch Availability:** Filter by specific engineering disciplines
- **Reservation Category:** Adjust cutoff ranks based on student category

Conclusions

The system provides reliable, defensible recommendations that balance objective performance metrics with subjective student preferences while maintaining full transparency and customizability.

Appendices

A. Technical Implementation

Programming Language: Python

Key Libraries:

- NumPy (matrix operations)

- SciPy (optimization)
- Pandas (data manipulation)
- PuLP (linear programming for DEA)

B. Sensitivity Analysis Results

Rank stability across 5 scenarios demonstrates that **C29, C24, and C14** consistently appear in the top 3 regardless of weight configuration, indicating robust recommendations.

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