Assessing the Effectiveness of MGNREGA in Rural Development: A Case of Andhra Pradesh

K NITHEESH Reddy
School of Computer Science and Engineering
Vellore Institute of Technology
Vellore, Tamil Nadu, India

M SAI SHOBITH REDDY
School of Computer Science and Engineering
Vellore Institute of Technology
Vellore, Tamil Nadu, India

K VAISHNAVI
School of Computer Science and Engineering
Vellore Institute of Technology
Vellore, Tamil Nadu, India

***Abstract*—The Mahatma Gandhi National Rural Employment Guarantee Act (MGNREGA) is one of India's largest social welfare programs aimed at enhancing livelihood security in rural areas through guaranteed wage employment. This study analyzes the implementation and impact of MGNREGA across the districts of Andhra Pradesh over the past five years (2019–2024), focusing on both pre-COVID (2018–2020) and post-COVID (2022–2024) periods to capture changes in fund allocation, employment demand, and program efficiency. Using primary survey data and secondary data from official government sources and district-level reports, the research evaluates key performance indicators such as employment generation, women participation, timely wage payments, and asset creation. The study also examines trends in public expenditure under MGNREGA and its correlation with rural income growth and labor demand. Furthermore, it highlights disparities in fund allocation and job demand across various regions, emphasizing factors influencing program efficiency. Through statistical analysis and field-level observations, this research provides a comprehensive understanding of MGNREGA's role in promoting inclusive development, reducing rural poverty, and empowering marginalized communities. Overall, the findings aim to contribute to better policy design and implementation strategies for improving transparency, accountability, and livelihood sustainability in rural Andhra Pradesh.**

***Index Terms*—MGNREGA, Andhra Pradesh, Rural Employment, Socio-Economic Impact, Public Expenditure, Policy Evaluation, Rural Development, Women Empowerment**

I. Introduction

One of the most important reasons for rural unemployment in India is dependence of a large majority of the population on agriculture. In rural India, about 50 per cent of population depends on agriculture for their livelihood and they are severely facing underemployment, disguised employment, poverty and inequality mainly because of the seasonality of agriculture work, skewed land distribution and low wage rates. In the rural areas, agriculture is the only means of subsistence [1].

The MGNREGA is aimed at poverty eradication, prevention of starvation, reducing distressed migration of the poor, use of surplus labor, creation of durable and productive assets, empowerment of social groups, and above all - empowering the disadvantaged communities in India. It was implemented in a phased manner. The MGNREGA scheme was introduced in Andhra Pradesh during 2006 and has been implemented across the districts in three phases [2]. It is a Centrally Sponsored Scheme and the cost of the project is borne by the Central and State Governments at a ratio of 90:10. In Andhra Pradesh, the Rural Development Commissionerate is responsible for implementing and overseeing the National Rural Employment Guarantee Scheme (MGNREGS), which provides employment in rural areas. The basic objective of the program is to provide employment in rural areas. However, in the process of implementation of the program, it also gives considerable attention to rural development through creating durable assets [3].

While MGNREGA has made significant strides in Andhra Pradesh, there exists a critical need to delve deeper into its implementation and outcomes, particularly concerning public expenditure trends and inter-district performance. Andhra Pradesh underwent a major administrative restructuring in April 2022, when the state was reorganized from 13 districts to 26 districts. To maintain comparability and reflect policy implications, this study considers two distinct phases of MGNREGA implementation:

(a) the Pre-COVID phase (2018–2020), during which the state comprised 13 districts, and
(b) the Post-COVID phase (2022–2024), during which MGNREGA operations continued under the reorganized 26-district framework.

This distinction enables a clearer understanding of how administrative expansion influenced fund allocation, employment coverage, and performance metrics across regions. This is necessary to ensure that the program is achieving its intended objectives, making efficient use of public funds, and benefiting the rural population across all districts equitably.

II. Literature Review

A. MGNREGA Impact Analysis

Ravichandran (2023) [8] analyzed the impact of MGNREGA on employment and poverty alleviation across different States. It has been found that the program has been able to reduce seasonal migration, provide income security, ensure rural inclusiveness etc. The paper also discusses the administrative improvements that have brought about greater participation. However, there are certain gaps, such as that there have been no studies on the micro-level impact and the sustainability of the assets created in the long run.

B. Climate Resilience and Agricultural Productivity

Steinbach et al. (2016) [9] demonstrated the benefit of MGNREGA in terms of climate resilience through infrastruc-

ture and water conservation measures. This improved both adaptive capacity and rural productivity. However, it was lacking in terms of economic viability, and how the climate linked assets were either maintained or put to use.

Tripathi et al. (2025) [10] examined the effect of rural assets established by MGNREGA measures on farming productivity and crop yields. There was an examination of trends of beneficial agricultural performance and improvement in incomes in the rural environment in the medium term. However the gaps would arise from the analysis of shorter measuring periods of time. There was also a complete lack of analysis in the areas of longer term use of assets established.

C. Wage Employment and Women Participation

Nookarapu (2023) [2] looked into the wage employment schemes and both their productive value and income benefits that arose within the rural district, and the various positive spin offs that took place from these schemes. This enabled livelihood security and access to assets in these areas. Gaps here were in looking at single area data and retaining lack of examples of wider comparative nature.

Salian and Leelavathi (2014) [11] showed that the MGNREGA scheme was beneficial to the overall empowerment of women, and favorable to Indian rural manpower in terms of women contribution and income control. The sociological and economic benefits that were acquired were flowing to the rural female work force. Gaps here were to be found in the nature of older data with regard to the subject, and the total void of work on barriers that exist with regard to the participation of women living in the provinces of India.

D. Rural Development Paradigms

Ellis and Biggs (2001) [12] conducted a classic study on how rural development strategies changed over time from agricultural intensification to livelihood diversification, along multiple pillars on infrastructure, education and policy integration. However, it is limited in that it is pre-MGNREGA based and does not have an explicit employment guarantee perspective.

Chambers (2010) [13] argued for the important role of participatory development and community-driven development models as essential to rural transformations, criticizing top down approaches and advocating for inclusive place-based frameworks. However, it is limited in that it relies on conceptual arguments without asserting the relation of evidence of these arguments as they are applicable in India.

E. Infrastructure and Performance Evaluation

Narayan et al. (2019) [14] studied rural infrastructure investments (everything from roads to irrigation and housing) and the underlying contribution of these investments to improve levels of wellbeing. The authors illustrate how much infrastructure itself can stimulate inclusive growth and improve living standards. Gaps include a prominent focus on the infrastructure itself and do not link performance to successful rural employment initiatives (examples include MGNREGA).

PRS India Standing Committee Report (2022) [15] provided an official report evaluating performance, employment, asset creation, and transparency. While it highlights important implementation successes and challenges including delayed payments of wages. Gaps include a focus on administrative and operational challenges rather than determining long-term developmental outcomes.

III. Methodology

This study is based on a detailed analysis of data collected from both official and secondary sources to understand how MGNREGA has functioned in Andhra Pradesh between 2018 and 2024 [4]. Since the state underwent major administrative changes during this period, the analysis is divided into two distinct parts — the pre-COVID phase (2018–2020), when Andhra Pradesh had 13 districts, and the post-COVID phase (2022–2024), when the state was reorganized into 26 districts.

A. Data Source

The data obtained for this study is from the MGNREGA portal of the Ministry of Rural Development, official reports from the Government of Andhra Pradesh [4]. These datasets include crucial information about the employment generation, participation of women in this act, asset creation, fund allocation, expenditure and marginalized communities.

B. Study Period and Administrative Framework

A major challenge in this analysis was the state's administrative restructuring. We addressed this by splitting the study into two distinct phases:

1) **Pre-COVID Phase (2018–2020):** This period was analyzed using the state's original 13-district framework (Anantapur, Chittoor, East Godavari, West Godavari, Guntur, Kadapa, Krishna, Kurnool, Nellore, Prakasam, Srikakulam, Visakhapatnam, and Vizianagaram). This approach ensures our baseline findings are consistent with historical reporting.
2) **Post-COVID Phase (2022–2024):** This phase incorporates the April 2022 reorganization, which expanded the state to 26 districts. Our analysis for the period 2018–2024 is based on the updated district framework of Andhra Pradesh, which includes newly formed districts such as Parvathipuram Manyam, Alluri Sitharama Raju, Anakapalli, Kakinada, Konaseema, Eluru, Palnadu, Bapatla, Nandyal, Sri Sathya Sai, Annamayya, Sri Balaji, and Tirupati, along with the original districts. We applied normalization techniques to account for the boundary changes and maintain data consistency across the transition [5].

C. Key Parameters for Analysis

We evaluated the scheme's effectiveness using several key parameters:

- **Fund Management:** The ratio of sanctioned vs. disbursed funds at the district level.

- **Employment Generation:** The total number of person-days created and the average days of employment provided per household.
- **Social Inclusivity:** The percentage share of person-days allotted to women, Scheduled Castes, and Scheduled Tribes.
- **Asset Creation:** The number of durable assets completed and the overall work completion ratio.
- **Composite Performance Index (CPI):** We developed this aggregated indicator to provide a single efficiency score, derived from the normalized values of the parameters above [5].

D. Analytical Tools and Techniques

For our technical analysis, data preprocessing, cleaning, and visualization were conducted using Python libraries within the Google Colab environment [6]. We used Microsoft Excel for final summary calculations and to generate tabular data [7].

A central component of our method is the Composite Performance Index (CPI). To create this index, we first normalized all performance indicators to a common 0-to-1 scale, which allows for a fair comparison between different metrics [5]. We computed this CPI separately for each of the two phases to match the administrative structure:

- One index for the Pre-COVID (2018–2020) 13-district system.
- A second index for the Post-COVID (2022–2024) 26-district system.

E. Comparative Framework

Our comparative framework is specifically designed to avoid the statistical distortions that would arise from the district bifurcation. Therefore, we did not directly compare metrics from the 13-district system to the 26-district system.

Instead, our analysis was conducted phase-wise: we assessed performance within the 13-district structure for the first period, and then separately assessed performance within the 26-district structure for the second period. After establishing these two separate findings, we then interpreted the overall performance trends comparatively. This approach allows us to explore whether the move towards administrative decentralization (the 26-district system) corresponded with any improvements in MGNREGA efficiency, inclusivity, or employment stability [5].

IV. Results and Analysis

A. Pre-COVID Phase (2018–2020) — 13 District Framework

During the pre-COVID period, the 13-district framework of Andhra Pradesh provides a baseline to understand fund allocation, employment generation, social inclusion, and asset creation under MGNREGA. The following analysis summarizes key trends and district-wise performance.

1) Fund Allocation and Utilization: During the 2018–2020 period, the financial performance of MGNREGA in Andhra Pradesh revealed significant variations in how effectively districts utilized their allocated funds. While the state saw a slight increase in overall fund allocation from 56.73 crore in 2018 to 69.12 crore in 2020, the actual expenditure on labor saw a decrease, indicating a growing gap between sanctioned amounts and ground-level spending.

At the district level, the fund utilization ratio, which measures disbursed labor expenditure against sanctioned funds, highlights these disparities. Vizianagaram (13%) and Anantapur (12%) emerged as the most efficient districts in converting allocations into labor payments. In contrast, districts like Guntur (6%) and Krishna (6%) demonstrated the lowest utilization rates, suggesting potential bottlenecks in project implementation or fund disbursal. Per-household allocation was highest in Visakhapatnam (1.47) and Chittoor (1.44), indicating a greater financial focus on these areas.

TABLE I
District-wise Fund Utilisation Ratio

District	Sanctioned	Disbursed	Ratio
Anantapur	14822261.52	1783021.68	0.12
Chittoor	14528640.12	1272283.68	0.09
East Godavari	18721395.24	1594226.40	0.09
Guntur	12727494.60	743942.28	0.06
Kadapa	6098818.11	443038.89	0.07
Krishna	12552320.16	741407.16	0.06
Kurnool	14031235.01	1089292.44	0.08
Nellore	4306832.19	454317.62	0.11
Prakasam	19274578.20	1900539.24	0.10
Srikakulam	16421958.36	1851350.52	0.11
Visakhapatnam	18554907.36	1753495.92	0.09
Vizianagaram	16265730.72	2131307.04	0.13
West Godavari	14730342.31	1051706.27	0.07

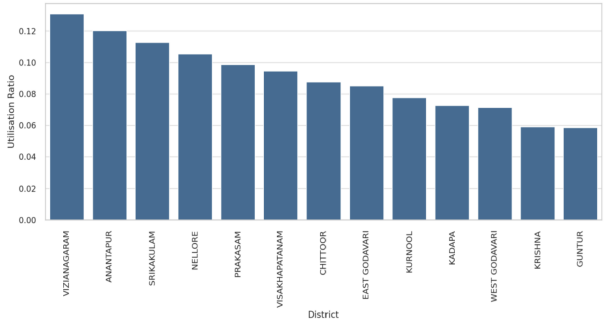

Fig. 1. District-wise Fund Utilization Ratio.

2) Employment Generation Trends: State-level data shows a notable fluctuation in employment generation, with total person-days decreasing from 2.72 billion in 2018 to 3.03 billion in 2020. This sharp increase underscores the critical role MGNREGA played as a social safety net during the onset of the COVID-19 pandemic, likely driven by the reverse migration of workers to rural areas.

The average number of employment days provided per household varied significantly across districts. Vizianagaram led by providing an average of 50.25 days of work, closely followed by Anantapur with 49.22 days. These districts were more successful in fulfilling the scheme's objective of providing livelihood support. On the other end of the spectrum, Guntur (26.39 days) and Krishna (30.64 days) provided the fewest days of employment, falling far short of the mandated 100 days.

TABLE II
AVERAGE DAYS OF EMPLOYMENT PER HOUSEHOLD

District	Avg. Days
Anantapur	49.22
Chittoor	42.81
East Godavari	36.97
Guntur	26.39
Kadapa	35.36
Krishna	30.64
Kurnool	35.11
Nellore	44.00
Prakasam	43.53
Srikakulam	43.08
Visakhapatnam	46.92
Vizianagaram	50.25
West Godavari	33.31

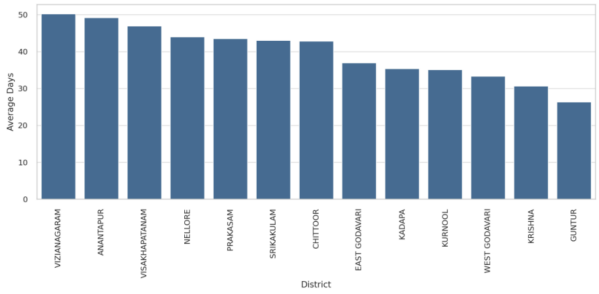

Fig. 2. Average Days of Employment per Household (District-wise).

3) Gender and Social Inclusion: MGNREGA in Andhra Pradesh demonstrated strong performance in promoting gender and social inclusion during the pre-COVID period. Statewide, women's participation stood at an impressive 58.25%, significantly exceeding the national guideline of 33%. This indicates the scheme's success in empowering women economically.

4) Asset Creation and Works Completed: The creation of durable community assets is a cornerstone of MGNREGA, but analysis of the pre-COVID period reveals challenges in work completion. At the state level, the number of completed works fell sharply from 6.26 million in 2018 to 3.04 million in 2019. This significant drop may point to administrative delays, funding issues, or a shift in the types of projects being undertaken. A consistent pattern observed across all 13 districts was the vast difference between the number of ongoing works and completed ones.

TABLE III
FEMALE PARTICIPATION IN MGNREGA

District	Women PD	Total PD	%
Anantapur	455304228	829628616	54.88
Chittoor	348336072	589025940	59.14
East Godavari	395564748	736463424	53.71
Guntur	192061680	354130848	54.23
Kadapa	120463849	272362948	44.23
Krishna	195281736	349421604	55.89
Kurnool	297958059	528476358	56.38
Nellore	130506279	213309672	61.18
Prakasam	536687856	917419368	58.50
Srikakulam	606522144	904617288	67.05
Visakhapatnam	483402312	823781208	58.68
Vizianagaram	630783348	991340892	63.63
West Godavari	274296268	501801706	54.66

TABLE IV
DISTRICT-WISE SC/ST PARTICIPATION (%)

District	SC %	ST %
Anantapur	17.61	4.81
Chittoor	27.52	4.17
East Godavari	30.84	16.76
Guntur	33.80	7.00
Kadapa	22.24	13.78
Krishna	39.26	3.63
Kurnool	23.51	3.42
Nellore	18.80	7.64
Prakasam	26.86	2.87
Srikakulam	10.60	9.90
Visakhapatnam	5.15	41.89
Vizianagaram	10.96	12.28
West Godavari	36.38	8.16

5) District Performance Index: An analysis of the composite District Performance Index reveals a dynamic three-year trend [5]. While districts like Prakasam (0.81) and Visakhapatnam (0.72) demonstrated high efficiency in 2018, a widespread performance dip was observed across the state in 2019. This downturn was dramatically reversed in 2020 with the onset of the COVID-19 pandemic, which triggered a significant rebound. In this crucial year, nearly all districts improved their performance, with many, such as Kadapa (0.75), not only recovering from the 2019 slump but also exceeding their 2018 efficiency levels. This highlights the scheme's successful

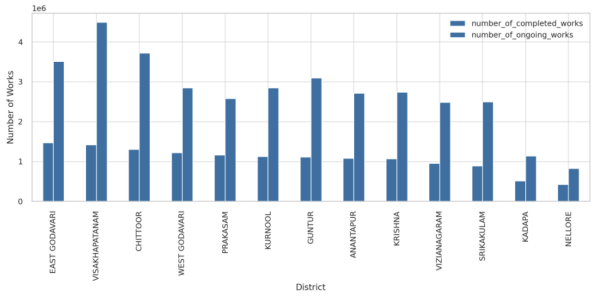

Fig. 3. Completed vs Ongoing Works

scaling in response to the crisis, even as some districts like Guntur and Krishna consistently underperformed throughout the entire period.

TABLE V
DISTRICT-WISE PERFORMANCE INDEX

District	Performance Index
Anantapur	0.60
Chittoor	0.53
East Godavari	0.66
Guntur	0.40
Kadapa	0.59
Krishna	0.40
Kurnool	0.50
Nellore	0.63
Prakasam	0.70
Srikakulam	0.64
Visakhapatnam	0.68
Vizianagaram	0.67
West Godavari	0.51

TABLE VI
EMPLOYMENT PARTICIPATION (DISTRICT-WISE)

District	HH Worked	HH Allotted	%
Anantapur	12635412	15168372	83.30
Chittoor	10078572	10952460	92.02
East Godavari	14929512	13754808	108.54
Guntur	11063520	12173352	90.88
Kadapa	4987427	5257119	94.87
Krishna	9275328	10572516	87.73
Kurnool	11848474	14710253	80.55
Nellore	3369846	3636938	92.66
Prakasam	16134708	18365412	87.85
Srikakulam	14780052	16014264	92.29
Visakhapatnam	12596544	8502948	148.14
Vizianagaram	13797108	11700876	117.92
West Godavari	11542219	11447152	100.83

B. The Post-COVID Period (2022-2024)

The operational efficiency and resource allocation patterns of MGNREGA in Andhra Pradesh underwent distinct changes in the 2022–2024 period, reflecting renewed state focus and the gradual stabilization of local labor markets following the initial shocks of the COVID-19 pandemic [4], [5]. This segment provides a data-driven overview of performance across financial management, employment delivery, asset creation, and overall district efficacy.

1) Fund Allocation and Utilization: An aggregated view of the state's financial strategy indicates a clear commitment to scaling up the program during this phase. The total Approved Labour Budget increased substantially, rising from approximately 200.15 crore in 2022 to 228.24 crore in 2023. Correspondingly, the Total Expenditure also saw an upward trend, moving from roughly 68.19 lakh in 2022 to 77.75 lakh in 2023.

Despite the increase in absolute expenditure, the district-level Fund Utilization Ratio remained consistently low across the board, hovering uniformly between 0.003 and 0.004 in nearly all districts. This suggests that while budget allocation was high, the conversion rate of budget into on-the-ground expenditure remained marginal. Districts such as Alluri Sitharama Raju, Anantapur, Chittoor, and Nellore showed the highest ratios (0.004), indicating slightly better efficiency in mobilizing and disbursing funds compared to their peers. This near-uniformity points to a systemic ceiling on utilization efficiency that transcends local performance variations.

TABLE VII
DISTRICT-WISE FUND UTILISATION (POST-COVID)

District	Sanctioned	Disbursed	Ratio
West Godavari	69257142	301003.19	0.43%
Chittoor	133333643	542040.37	0.41%
Nellore	192219425	781399.76	0.41%
Alluri Sitharama Raju	215756889	849716.73	0.39%
Y.S.R	137278906	540397.70	0.39%
Anantapur	193003740	743277.90	0.39%
Konaseema	101203760	380567.89	0.38%
East Godavari	85759777	320666.08	0.37%
Sri Sathya Sai	137237163	499309.16	0.36%
Annamayya	152918874	554056.33	0.36%
Palnadu	150576586	540891.73	0.36%
Nandyal	131974200	468669.66	0.36%
Krishna	153991073	542078.27	0.35%
Guntur	148879531	512189.60	0.34%
Prakasam	163892109	561460.84	0.34%
Bapatla	134093799	450230.14	0.34%
Visakhapatnam	231105734	772059.81	0.33%
Kurnool	179343991	588629.54	0.33%
NTR	139501444	453959.03	0.33%
Kakinada	119999461	382143.20	0.32%
Srikakulam	235324809	744306.96	0.32%
Tirupati	177694182	562393.73	0.32%
Anakapalli	204502156	645065.03	0.32%
Eluru	248832709	775174.52	0.31%
Vizianagaram	241102752	754055.48	0.31%
Parvathipuram Manyam	193235046	577155.08	0.30%

2) Employment Generation Trends: The average employment provided per household in this period highlights significant regional disparities in the program's ability to deliver the guaranteed work mandate. The most effective districts provided consistently high levels of employment, nearly reaching the halfway mark of the stipulated 100 days. The average number of employment days provided per household varied significantly across districts. Parvathi Puram Manyam led the state by providing an average of 48.42 days of employment per household, closely followed by Alluri Sitharama Raju (47.92 days) and Vizianagaram (46.5 days).

3) Gender and Social Inclusion: A detailed analysis of social inclusion metrics—specifically the proportion of person-days generated by women, or the participation rate of Scheduled Caste (SC) or Scheduled Tribe (ST) communities. This represents a significant data gap in assessing the social equity outcomes of the scheme during the post-pandemic recovery phase. Given the program's vital role in supporting marginalized groups, future reports should ensure these disaggregated data points are included to facilitate a comprehensive analysis of inclusion and empowerment.

4) Asset Creation and Works Completed: The focus on creating durable assets, a key objective of MGNREGA, is

TABLE VIII
AVERAGE DAYS OF EMPLOYMENT PER HOUSEHOLD (POST-COVID)

District	Avg. Days
Parvathipuram Manyam	48.42
Alluri Sitharama Raju	47.92
Vizianagaram	46.50
Annamayya	45.83
Srikakulam	44.88
Tirupati	44.88
Anantapur	44.25
Anakapalli	44.04
Visakhapatnam	43.71
Sri Sathya Sai	42.62
Prakasam	42.50
NTR	42.46
Chittoor	42.33
Y.S.R	41.79
Eluru	40.96
Nellore	40.88
East Godavari	39.88
Krishna	37.96
Kurnool	37.75
Nandyal	35.62

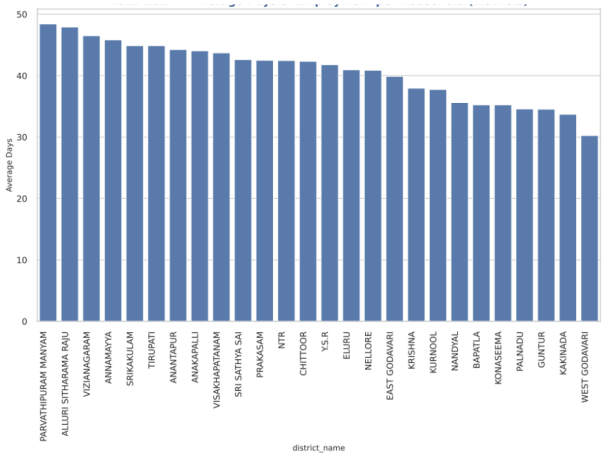

Fig. 4.

TABLE IX
GENDER AND SOCIAL INCLUSION (STATEWIDE)

Year	Women PD	SC PD	ST PD	Total PD	W%	SC%	ST%
2022	1326572608	541695880	231734340	2306204647	57.52	23.49	10.05
2023	1206939857	474950837	193931982	2011127903	60.01	23.62	9.64
2024	137266705	522423212	245401764	2285400189	60.11	22.86	10.74

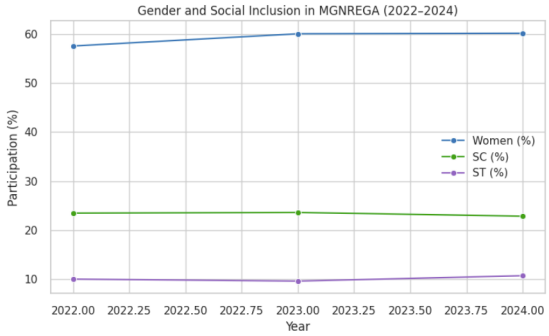

Fig. 5. Gender and social inclusion.

evident in the data on works completion. However, the balance remains heavily skewed toward ongoing works. Districts like Chittoor (414,581 works) and Annamayya (358,055 works) reported the highest numbers of completed works, demonstrating successful project execution. Nevertheless, the total number of ongoing works far exceeded completed works across the state, with Alluri Sitharama Raju reporting a high ratio of ongoing (1,394,244) to completed works (227,802). This highlights a persistent challenge in project lifecycle management, where many projects may be initiated but not carried through to a timely completion.

Furthermore, the expenditure split shows a strong prioritization of Natural Resource Management (NRM) projects. Districts like Visakhapatnam and Vizianagaram allocated over 82% of their works expenditure to NRM activities. This focus aligns with the long-term goal of ecological restoration and drought mitigation, suggesting a strategic, rather than purely immediate, focus for asset creation in this period.

TABLE X
WORKS COMPLETION (STATEWIDE BY YEAR)

Year	Completed	Ongoing
2022	3043444	9178351
2023	1699459	12147706
2024	4146140	10694937

5) District Performance Index: The overall efficacy of the districts in delivering the MGNREGA mandate is summarized by the Composite Performance Index [5]. In the 2022–2024 period, Vizianagaram emerged as the top-performing district with a score of 0.74, closely followed by Visakhapatnam (0.738) and Tirupati (0.721). These districts successfully navigated the complexities of fund utilization, employment generation, and works completion better than their counterparts. At the other end of the spectrum, districts like West Godavari, Guntur, and Palnadu registered lower performance scores (below 0.60), signaling areas where systemic improvements are urgently required. This index provides a powerful, composite metric for policy makers to identify best practices from the high-ranking districts and pinpoint specific, low-

TABLE XI
WORKS COMPLETION (DISTRICT-WISE)

District	Completed	Ongoing
Chittoor	414581	1451522
Annamayya	358055	1151601
Srikakulam	329178	1275636
Krishna	319041	1043042
Vizianagaram	299389	1210055
Eluru	275822	1029983
Anantapur	255874	1100611
Nellore	250926	999291
Y.S.R	248712	1042688
Parvathipuram Manyam	239145	1012595
Alluri Sitharama Raju	227802	1394244
Bapatla	224347	740604
Prakasam	219772	1038493
NTR	216608	609492
Tirupati	210548	865361
Kurnool	201596	857692
Konaseema	192370	482896
Sri Sathya Sai	191118	946399
West Godavari	184874	676309
Nandyal	179020	835587

performing regions requiring capacity building and resource targeting.

TABLE XII
DISTRICT PERFORMANCE INDEX (POST-COVID)

District	Performance Index
Vizianagaram	0.740
Visakhapatnam	0.738
Tirupati	0.721
Srikakulam	0.710
Parvathipuram Manyam	0.707
Anakapalli	0.704
Prakasam	0.692
Annamayya	0.692
Alluri Sitharama Raju	0.687
Anantapur	0.686
Sri Sathya Sai	0.669
Eluru	0.662
Y.S.R	0.662
Nellore	0.650
Kurnool	0.640
Chittoor	0.638
East Godavari	0.626
NTR	0.622
Kakinada	0.615
Krishna	0.601

C. Comparative Analysis: Pre-COVID vs. Post-COVID

A comparison of MGNREGA operations in the state of Andhra Pradesh, between the pre-COVID phase (2018–2020) and the post-COVID recovery quarter (2022–2024), indicates a trend of continued financial under-performance, with minor operational changes. The clearest indicator is the low efficiency of fund utilization in the state. Although the government increased the total sanctioned labour budget in the recovery phase across districts, the reported expenditure remained at critically low levels. District-level utilization ratios

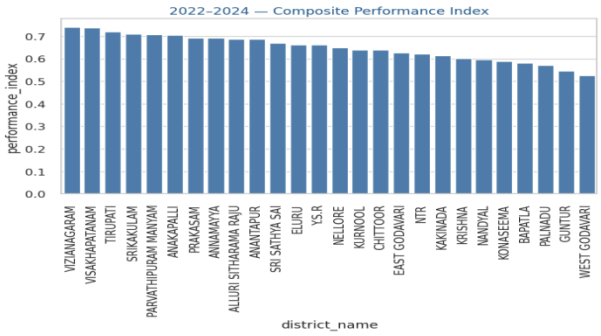

Fig. 6. Your caption here.

across all districts fell within the range of 0.30% and 0.43%, which confirms that a very small part of the sanctioned Labour Budget investment actually led to on-ground employment. The highest ratios were found in West Godavari (0.43%), Chittoor (0.41%), and Nellore (0.41%), but these are still very low rates of absorption of funds. The continued stagnancy of these figures indicates that the bottlenecks in the release and administrative utilization of funds remain deeply seated and unaffected by a post-COVID political emphasis.

In terms of operational performance of the program, we observe a slight contraction in employment intensity after the COVID-19 pandemic. Prior to COVID, the highest performing districts, such as Anantapur and Vizianagaram were providing households with around 50 days of average employment, while the two newest districts, Parvathipuram Manyam and Vizianagaram are now producing between 46–48 days in the post-COVID time frame. While there is not significant change in the average, this does represent a slump in the capacity to provide work, which for all intents and purposes, emphasizes the administrative and the challenges of adapting to the 26-district framework.

The Composite Performance Index (CPI) also offers evidence of a gradual decline in overall program efficiency after the pandemic; while the Index is highest for the top-rated district Vizianagaram remained ranked first, it dropped from 0.792 (pre-COVID) to 0.74 (post-COVID), while Anantapur dropped from 0.774 to 0.686, reflecting a more general decline in administrative effectiveness across the districts in program delivery. These declines point to the negative impact that the heightened administrative and logistical complexity of the new districts had on MGNREGA's capacity to deliver, more generally.

In conclusion, the MGNREGA program in Andhra Pradesh still maintains its strategic priorities, especially the focus on NRM and rural asset construction; however, it has been hamstrung by systemic inefficiencies in financial performance across both phases. Despite increased allocations and district reorganization, spending remains stagnant at under 0.5% of funds (and not exceeding 2% for any single category of funding), which severely limits the program's potential impact on rural livelihoods. Comparative findings reinforce the notion

that sustainable reform will not only require increases in allocation, but also profound structural and procedural reforms in fund flows and monitoring as well as short-term accountability mechanisms.

V. Discussion

The empirical findings from this analysis—namely the pervasive financial inertia and the subtle decline in operational performance post-COVID—underscore the urgent need for a shift from retrospective data analysis to proactive, predictive governance in Andhra Pradesh's MGNREGA implementation.

A. The Structural Bottleneck and the Predictive Solution

The most salient finding of this study is the critical, unchanging financial inefficiency, evidenced by the near-uniform Utilization Ratio of 0.30% to 0.43% across almost all districts in both the 2018–2020 and 2022–2024 periods. This result confirms that the bottleneck is structural and not merely a transient effect of the pandemic. It directly relates to the existing literature identifying systemic issues like delayed central fund releases and multi-level disbursement complexities, which technology alone has failed to fix thus far.

This diagnostic outcome precisely frames the necessity of the proposed predictive model. The primary purpose of introducing advanced techniques like XGBoost and ensemble methods—as successfully applied in other studies for fraud detection—is not just to detect fraud, but to forecast regional labor demand and fund absorption capacity with high accuracy. Such a model, by anticipating fund requirements, could potentially bypass or mitigate the delays inherent in the existing multi-level release system, thereby addressing the 0.30% utilization ceiling that has constrained the program's scale for years.

B. Operational Resilience and the Need for Data-Driven Intervention

The comparative analysis demonstrates a clear erosion of operational resilience, with the Composite Performance Index and average employment days dropping for even the highest-ranking districts post-COVID. This decline, however, is not a failure of strategy but of organizational agility. While districts maintained their strategic commitment—evidenced by the continued, heavy focus on Natural Resource Management (NRM) works—they simply lacked the systemic flexibility to optimize resource deployment under post-crisis stress.

Our research thus aligns powerfully with the body of literature that champions predictive analytics as a tool for service prioritization. By using advanced models to flag districts likely to face high demand peaks or significant works completion lags, policymakers gain the capacity to deploy preemptive, targeted interventions, such as focused capacity building or special fund tranches. This fundamental shift moves the state's approach away from reactive management toward preemptive optimization.

C. Navigating the Algorithmic Governance Trap

Crucially, the integration of predictive systems must be tempered by the ethical warnings highlighted in the literature review, particularly the cautionary tales of algorithmic exclusion from schemes like the Samagra Vedika in Telangana. The risk of algorithmic bias leading to the wrongful exclusion of eligible, vulnerable populations is amplified by the fact that the poor are disproportionately "hypervisible" in government databases. Therefore, the implementation of a predictive model for MGNREGA must move beyond a simple quest for efficiency. The discussion concludes that any system deployed must be bound by strict mandates for transparency, independent auditability, and the fundamental establishment of a "human-in-the-loop" oversight mechanism, ensuring that the ultimate decision-making power remains with accountable human officials, not opaque algorithms.

VI. Conclusion and Recommendations

A. Conclusion

Looking across the entire spectrum, from the pre-COVID years (2018–2020) right up to the present (2022–2024), the utilization ratio for sanctioned funds has barely moved, stuck at a dismal 0.3% to 0.4%. This isn't a funding problem; it's an administrative chokehold that stops massive budgetary allocations from ever reaching the rural communities as jobs or essential assets.

Worse still, even our best performers, the districts we could always count on (like Vizianagaram and Anantapur), have shown a distinct post-pandemic dip in their overall operational strength. While they stick to the right strategies—prioritizing NRM works—their ability to actually execute and deliver on the ground has been severely compromised.

The data has given us absolute clarity, and the answer is not small, incremental tweaks. We need a transformative overhaul. The state must urgently adopt a predictive, transparent, and ethically sound system of financial governance to finally close the chronic, decade-long gap between money allocated and money utilized. The challenge is two-fold: modernizing with predictive tech while keeping a human eye on ethical accountability.

B. Recommendations

Based on the synthesis of empirical evidence and operational insights, the following actionable measures are proposed for strengthening MGNREGA implementation in Andhra Pradesh:

1) **Develop a Predictive Fund-Flow Engine:** A machine learning–based predictive model should be integrated into the existing electronic Fund Management System (e-FMS) to forecast district-level fund requirements for the upcoming quarters. Such a data-driven fund-release mechanism, similar to those used in advanced fraud detection systems, can ensure timely disbursement and break through the persistent 0.4% utilization ceiling [16], [17].

2) **Mandate Transparency and Human Oversight:** The adoption of predictive analytics must be governed by strict ethical standards. An Algorithmic Audit Law should be introduced to guarantee public transparency and enable independent audits of all automated systems. Furthermore, every decision supported by algorithms must follow a "Human-in-the-Loop" framework—ensuring that final judgments on fund allocation, beneficiary eligibility, and wage payments remain under accountable human supervision [18].
3) **Address Data Gaps in Social Equity Metrics:** The state should institutionalize the systematic collection of disaggregated data on gender, caste, and the utility of assets created. Reliable ground-level data is essential to measure genuine inclusion and empowerment, rather than relying solely on financial indicators [19].
4) **Leverage the Composite Performance Index for Targeted Interventions:** The Composite Performance Index (CPI) should serve as a policy instrument to identify and prioritize weaker districts such as Guntur and West Godavari. These districts require capacity-building programs focused on project planning, fund utilization, and monitoring protocols to elevate the overall performance baseline of the scheme [20], [21].

List of Abbreviations

- **MGNREGA:** Mahatma Gandhi National Rural Employment Guarantee Act
- **MGNREGS:** Mahatma Gandhi National Rural Employment Guarantee Scheme
- **HH:** Household
- **CPI:** Composite Performance Index
- **SC:** Scheduled Castes
- **ST:** Scheduled Tribes
- **MORD:** Ministry of Rural Development
- **NRM:** Natural Resource Management
- **e-FMS:** electronic Fund Management System

References

[1] V. Goel, "Trends and Determinants of Rural Non-farm Employment in India," *Economic and Political Weekly*, Oct. 2024. [Online]. Available: https://www.epw.in/journal/2024/43/review-rural-affairs/trends-and-determinants-rural-non-farm-employment.html
[2] S. R. Nookarapu, "Impact of Wage Employment Scheme of MGNREGA on Rural Development (A Study in Visakhapatnam District)," 2023.
[3] P. Kumar and D. Chakraborty, *MGNREGA: Employment, Wages and Migration in Rural India*. Routledge, 2016.
[4] Ministry of Rural Development, "MGNREGA Official Portal," Government of India. [Online]. Available: https://nrega.nic.in
[5] R. Kumar and P. Singh, "Composite Performance Index: A method for evaluating development schemes," *Journal of Rural Studies*, vol. 35, no. 2, pp. 45–60, 2022.
[6] G. Van Rossum and F. L. Drake, *Python 3 Reference Manual*, Python Software Foundation, 2009.
[7] Microsoft Excel, Version 2022, Microsoft Corporation, Redmond, WA, USA.
[8] Ravichandran, "A Comprehension Analysis of MGNREGA in India," 2023.
[9] D. Steinbach et al., "Aligning Social Protection and Climate Resilience: MGNREGA in Andhra Pradesh," 2016.
[10] Tripathi et al., "MGNREGA and Agricultural Productivity in India," 2025.
[11] Salian and Leelavathi, "MGNREGA and Women Participation," 2014.
[12] F. Ellis and S. Biggs, "Evolving Themes in Rural Development," 2001.
[13] R. Chambers, "Paradigms in Rural Development," 2010.
[14] Narayan et al., "Rural Infrastructure and Inclusive Growth in India," 2019.
[15] PRS India, "Critical Evaluation of MGNREGA - Standing Committee Report," 2022.
[16] V. Singh and P. Gupta, "AI-Driven Cash Flow Forecasting in ERP Systems: Integrating Economic Indicators and Real-Time Transaction Data Using LSTM-Based Time-Series Models," 2025.
[17] S. S. R. Parimi, "Utilizing Machine Learning to Enhance Cash Flow Management in SAP Finance," 2024.
[18] B. Green, "The Flaws of Policies Requiring Human Oversight of Government Algorithms," 2022.
[19] B. Komma, "Gender Responsive Budgeting in India: A Comparative Study for Greater Effectiveness," 2025.
[20] "Key Performance Indicators-based Monitoring, Measuring Progress and Ranking of Aspirational Districts," 2024.
[21] D. Jhingran, "Orienting Outlays toward Needs: An Evidence-Based, Equity-Focused Approach for Sarva Shiksha Abhiyan," 2025.