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3 **Mapping a climate change vulnerability index: An assessment in agricultural,**
4 **geological and demographic sectors across the districts of Karnataka**

5
6 **Abstract**

7 Climate change is a continuous phenomenon and over hundreds of years, the atmosphere
8 has changed considerably around the world. Karnataka has the second largest drought prone area
9 in the country next only to Rajasthan. Assessment of vulnerability index can play a major role in
10 designing appropriate mitigation and adaptation policies to overcome the impacts of climate
11 change. The vulnerability assessment is an exhaustive procedure influenced by a large number of
12 indicators. This study attempts to capture a picture of composite vulnerability index of different
13 districts of Karnataka by considering agronomic, climatic and demographic indicators. The
14 secondary data on climatic, agronomic and demographic factors were collected from various
15 sources for the year 2017-18. The findings of the study as shown that the average vulnerability
16 index for 30 districts is 0.577 and 16 districts placed above the average composite vulnerability
17 index level. Bidar (0.655) is the most vulnerable district followed by Kolar (0.658) and Yadgir
18 (0.638) districts. Shivamogga (0.440), Davanagere (0.486) and Udupi (0.486) districts exhibit the
19 least vulnerability to changing climate. The results suggest that agricultural and climatic
20 indicators are the major factors which influence vulnerability. So special attention should be
21 given to agricultural and climatic sectors to minimize the impacts of climatic change in the most
22 vulnerable districts.

23 **Key words:** Vulnerability index, Climate change, Per capita income, Sensitivity, Exposure and
24 Adaptability

25
26 **Introduction:** Agricultural economy in Karnataka is largely influenced by agro-climatic factors,
27 water and other resource endowments of farmers, technology, infrastructure, tradition and social
28 capital as also the market forces of demand and supply. Karnataka has the second largest drought
29 prone area in the country next only to Rajasthan and water availability is one of the major

30 concerns in the state. Karnataka's annual rainfall is 1,151 mm on an average, of which 80 per
31 cent is received during the southwest monsoon, 12 per cent in the post monsoon period, 7 per
32 cent during summer and 1 percent in rabi.. Groundwater potential of the area depends on rainfall
33 and efforts to recharge. Change in climatic conditions directly affects the hydrological cycle and
34 gradually the groundwater table. Obviously the economic impact of climate change will severely
35 affect the food security as well as livelihood security including health security of farmers
36 (Chandrakanth, M. G., 2015).

37 Climate change is a continuous phenomenon and over hundreds of years, the atmosphere
38 has changed considerably around the world. However, the pace and pattern of changes in
39 climatic factors in recent decades have turned into a matter of concern. It is very hard to
40 comprehend the effect of change in climatic factors at the small scale level even, say, at block or
41 district levels (Raju *et al.*, 2017). The Intergovernmental Panel on Climate Change (IPCC), in its
42 second evaluation report (Anonymous, 1996), characterizes vulnerability as the degree to which
43 environmental change may harm or damage a system. It infers that vulnerability not only
44 depends on a system of sensitivity, but also in addition, on its capacity to adjust to new climatic
45 conditions, the level of economic development and institutions.

46 **2. Methodology:**

47 The key target of this assessment is to analyse the climate vulnerability of different
48 sectors across the districts of Karnataka. Keeping in view of this appraisal the information
49 relating to different indicators pertaining to agriculture year 2013-14 to 2017-18 were collected
50 from various sources such as Karnataka State Natural Disaster Monitoring Centre (KSNDMC),
51 Directorate of Economics and Statistics (DES) and Central Groundwater Board (CGB).

52 The vulnerability assesment is an exhaustive procedure influenced by a large number of
53 indicators. However only the most significant and appropriate indicators were chosen for
54 calculation of vulnerability index based on exposure, sensitivity and adaptability to varied
55 climate. Parameters used in this study include

56 **Climatic components:** Variance of annual rainfall (mm^2), Variance of South-West monsoon
57 (mm^2), Variance of maximum temperature, Variance of minimum temperature and Variance of
58 average temperature.

59 **Agricultural Components:** Geographical area (GA) (ha), Forest area (% of GA), Area under
60 food crops (% of Gross Cropped Area(GCA)), Net sown area (% of GA), Livestock population
61 (No. per ha of GCA), Irrigated area (% of GCA), Cropping intensity (%), Productivity of major
62 crops (Paddy, Ragi, Jowar, Sugarcane, Maize, Groundnut, Sunflower, Cotton, Arecanut,
63 Coconut, Redgram, Cowpea, Chilli), Depth of Groundwater (meter below ground level), Per
64 capita income (Rs per person).

65 **Demographic components:** Density of male population (Persons per sq. ha of GA), Density of
66 female population (Persons per sq. ha of GA), Literacy rate of male (%) and Literacy rate of
67 female (%).

68 Composite Vulnerability Index (CVI) is assessed for each district by using Iyenger and
69 Sudarshan (1982) technique for unequal weight. The assessed CVI is a total of three sub-sectors
70 specifically Climatic Vulnerability, Agriculture Vulnerability and Demographic Vulnerability.
71 Development of vulnerability index and Composite Vulnerability Index comprises of several
72 steps.

73 **Step 1:** The information compiled pertaining to three components was transformed into suitable
74 estimation units and arranged in a rectangular matrix with rows representing districts and
75 columns representing indicators.

76 **Step 2:** Since every one of the sub-component is measured using different units and scale, they
77 need to normalized first. The procedure developed by Anand and Sen (1994) for construction of
78 the Human Development Index (HDI) is used to normalize indicators. In any case, before doing
79 normalization, it is imperative to distinguish the functional relationship between the indicators
80 and vulnerability. Two kinds of practical relationships, vulnerability increases with the increase
81 (decrease) in the value of indicators are conceivable.

82 For direct relationship:
$$Y_{ij} = \frac{X_{ij} - \text{Min}(X_{ij})}{\text{Max}(X_{ij}) - \text{Min}(X_{ij})}$$

83

84 For indirect relationship:
$$Y_{ij} = \frac{\text{Max}(X_{ij}) - X_{ij}}{\text{Max}(X_{ij}) - \text{Min}(X_{ij})}$$

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86 Where,

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88 Y_{ij} = is the normalized value

89 X_{ij} is the actual value of the indicator

90 $Min(X_{ij})$ and $Max(X_{ij})$ are the minimum and maximum actual values

91 **Step 3:** The degree of vulnerability (\bar{y}_i) is assumed to be the linear sum of X_{ij} as

$$\bar{y}_i = \sum_{j=i}^k w_j x_{ij}$$

92 Where w_j 's are weights and are determined by

$$w_j = \frac{c}{\sqrt{var(x_{ij})}}$$

93 Where c is the normalizing constant

$$c = \left[\sum_{j=1}^k \frac{1}{\sqrt{var(x_{ij})}} \right]^{-1}$$

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95 The vulnerability index lies in the range of 0 and 1. A value of 1 indicates greatest vulnerability
96 and 0 shows absence of vulnerability.

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98 **3. Results and Discussion:**

99 The Sector wise vulnerability indices and composite index were constructed for all the 30
100 districts of Karnataka. The districts were ranked based on extent of vulnerability index.

101 **3.1 Component wise vulnerability index**

102 **3.1.1 Climatic Vulnerability index**

103 To construct district level vulnerability index five climatic variables were used and the
104 results are presented in the Table 1. The results show that the Kalaburagi district has the highest
105 climate vulnerability index of 0.747 followed by Kolar (0.720), Bidar (0.720), Raichur (0.712)
106 and Yadgir (0.711) districts. The districts of Kodagu and Udupi have only 0.278 and 0.215
107 vulnerability index respectively, the least in Karnataka state. We can observe highest
108 vulnerability index values in northern districts of Karnataka which is due to large variations in
109 rainfall and temperature during the year. These are the key determinant indicators which explain
110 high climatic fluctuations among districts.

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112 For instance, Prevalence of a high degree of anticipated change in mean precipitation and
113 high inconsistency in minimum and maximum temperatures drove Kalaburagi district to the top
114 of the chart.

115 **3.1.2 Agriculture Vulnerability index**

116 Based on functional relationship of the indicators, Vulnerability index for agricultural parameters
117 were calculated for each district and is presented in Table 2.

118 Kodagu district secures first place with a total vulnerability index value of 0.787 followed
119 by Bidar (0.761), Kolar (0.741) and Chitradurga (0.732) districts. Whereas Davanagere has been
120 rated as least vulnerable district (0.524). Lower productivity, declined forest area, high
121 groundwater table level, lower cropping intensity and low per capita income are the major
122 factors which influence the high level of sensitivity leading to higher vulnerability index.

123 In general Kodagu, Bidar, Kolar and Chitradurga districts are most sensitive districts and
124 highly vulnerable to climate change. On the contrary, Davanagere, Shivamogga, Bellary and
125 Bengaluru Urban districts are less sensitive and least vulnerable to changing climate.

126 **3.1.3 Demographic vulnerability index**

127 The districts having high population density coupled with a lower rate of literacy were
128 identified as vulnerable districts with respect to demographic features.

129 Bengaluru Urban (0.579) district occupied the first place whereas Dakshina Kannada
130 (0.039) district is placed in the last position with respect to demographic vulnerability (Table 3).
131 Yadgir (0.449), Raichur (0.353), Chamarajnagara (0.335) and Kalaburagi (0.294) are the districts
132 having higher degree of vulnerability index next to Bengaluru Urban district. The coastal
133 districts of Dakshina Kannada, Udupi (0.051) and Uttara Kannada (0.055) are having lower
134 vulnerability index and higher adaptive capacity to changing climate because of high literacy rate
135 and lower population density.

136 **3.2 Composite vulnerability index**

137 Agricultural indicators, climatic indicators and demographic indicators were used to
138 construct composite vulnerability index. Table 4 shows district wise composite vulnerability
139 index which is calculated using all the three sub-components (Agricultural, Climatic and
140 Demographic). Average composite vulnerability index for 30 districts is 0.584 and 17 districts
141 placed above the average composite vulnerability index level. Districts having high composite

142 vulnerability index will be highly vulnerable to climate change. Bidar (0.577) district is having
143 the highest composite vulnerability index followed by Kolar (0.658) and Yadgir (0.638). These
144 districts are most vulnerable districts and the results are inline with the report submitted by
145 Anonymous (2011) which used composite vulnerability index. They reported that Kalaburagi
146 and Dakshina Kannada districts were the most and the least vulnerable districts, respectively.
147 Higher composite index is observed mainly due to higher sensitivity of agricultural sector and
148 larger exposure to climate change. Composite vulnerability index is lower for Shivamogga
149 (0.440), Davanagere (0.486) and Udupi (0.486) districts because these districts are showing less
150 vulnerability in terms of agriculture and climatic indicators. In addition also demographic
151 variables such as population density and literacy rate have contributed to lowering of composite
152 vulnerability index . At district level, contribution of each sub-component to composite index is
153 not uniform. In general agricultural indicators contributed foremost, followed by climatic and
154 demographic indicators. A study conducted by Hiremath and Shiyani (2013) reported that
155 agriculture and occupation sector were the major sectors which have contributed most to
156 composite vulnerability index in Saurashtra.

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159 **4. Conclusion:**

160 Karnataka is the second most drought prone state after Rajasthan. District wise
161 vulnerability mapping was carried out to calculate the vulnerability index of each district. Sector
162 wise indicators were selected based on exposure, sensitivity and adaptive capacity to climate
163 change. All the indicators were considered to calculate composite vulnerability index. Findings
164 of the analysis shows that Bidar is the most vulnerable district and Shivamogga is the least
165 vulnerable. Major component which is contributing to composite index is the Agricultural
166 vulnerability. The results of agricultural vulnerability index analysis has highlighted the
167 indicators such as productivity of the major crops, cropping intensity and per capita income are
168 the major drivers in determining the vulnerability of districts. Therefore, it is suggested that
169 Bidar, Kolar, Yadgir, Koppal and Chtradurga districts should be considered under on priority to
170 minimize degree of vulnerability. There is a need to take up adaptive practices such as varietal
171 selection according to prevailing weather, contingent cropping, soil and water conservation
172 measures, in-situ moisture conservation, rainwater harvesting and augmenting recharging of

173 groundwater for supplementary irrigation. In addition, better education and infrastructure
174 development in rural areas will also play a catalytic role in enhancing adaptive capacity of these
175 districts.

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198 **Table 1: Index of climate vulnerability across the various districts of Karnataka**

Sl. No	Districts	Annual rainfall	S-W monsoon	Max Temp	Min Temp	Avg Temp	Index total
1	KALABURAGI	0.177	0.174	0.102	0.169	0.125	0.747
2	KOLAR	0.170	0.183	0.189	0.107	0.073	0.720
3	BIDAR	0.173	0.169	0.120	0.189	0.069	0.720
4	RAICHUR	0.183	0.183	0.082	0.127	0.138	0.712
5	YADGIR	0.181	0.177	0.088	0.130	0.135	0.711
6	VIJAYAPURA	0.185	0.182	0.087	0.147	0.100	0.701
7	RAMANAGARA	0.163	0.178	0.165	0.085	0.103	0.693
8	BALLARI	0.186	0.187	0.100	0.054	0.154	0.681
9	KOPPALA	0.183	0.184	0.063	0.096	0.141	0.667
10	BAGALKOTE	0.188	0.185	0.078	0.109	0.095	0.656
11	DHARWAD	0.181	0.179	0.118	0.094	0.070	0.643
12	DAVANAGERE	0.178	0.179	0.066	0.046	0.125	0.593
13	GADAG	0.189	0.186	0.061	0.075	0.082	0.593
14	CHITRADURGA	0.183	0.185	0.060	0.044	0.119	0.591
15	CHIKKABALLAPURA	0.176	0.183	0.055	0.077	0.094	0.585
16	BELAGAVI	0.174	0.166	0.058	0.103	0.083	0.584
17	TUMAKURU	0.176	0.181	0.044	0.055	0.105	0.561
18	HAVERI	0.179	0.174	0.072	0.051	0.082	0.559
19	MANDYA	0.172	0.185	0.038	0.026	0.116	0.537
20	MYSURU	0.173	0.182	0.023	0.036	0.101	0.514
21	CHAMARAJANAGARA	0.172	0.189	0.000	0.028	0.086	0.475
22	UTTARA KANNADA	0.078	0.074	0.139	0.077	0.106	0.474
23	BENGALURU RURAL	0.164	0.175	0.023	0.052	0.056	0.470
24	BENGALURU URBAN	0.157	0.168	0.015	0.038	0.055	0.431
25	HASSAN	0.152	0.149	0.024	0.043	0.052	0.421
26	CHIKKAMAGALURU	0.128	0.126	0.076	0.039	0.042	0.412
27	SHIVAMOGGA	0.103	0.082	0.053	0.058	0.076	0.372
28	DAKSHINA KANNADA	0.031	0.030	0.045	0.000	0.189	0.294
29	KODAGU	0.080	0.082	0.094	0.022	0.000	0.278
30	UDUPI	0.000	0.000	0.024	0.022	0.170	0.215

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Table 2: Agricultural vulnerability index across the districts of Karnataka

District	Geographical area(Ha)	Forest area(% to GA)	Total food crops(% to GCA)	Net sown area(% to GA)	Livestock pon(No. per Ha of GCA)
Kodagu	0.008	0.032	0.055	0.027	0.065
Bidar	0.013	0.051	0.026	0.016	0.063
Kolar	0.007	0.051	0.012	0.027	0.057
Chitradurga	0.026	0.048	0.031	0.024	0.059
Koppal	0.014	0.051	0.018	0.010	0.062
Hassan	0.019	0.048	0.022	0.021	0.061
Gadag	0.010	0.049	0.020	0.001	0.064
Dakshin Kannada	0.011	0.036	0.013	0.034	0.063
Dharwad	0.008	0.049	0.023	0.003	0.064
Haveri	0.011	0.048	0.021	0.006	0.062
Chikballapura	0.008	0.046	0.016	0.024	0.058
Bengaluru Rural	0.000	0.051	0.026	0.022	0.061
Kalaburagi	0.036	0.052	0.006	0.009	0.064
Raichur	0.026	0.053	0.014	0.018	0.061
Tumkuru	0.035	0.051	0.037	0.024	0.059
Mysuru	0.017	0.047	0.021	0.016	0.062
Chamarajanagara	0.014	0.021	0.017	0.034	0.061
Yadgir	0.013	0.050	0.028	0.014	0.061
Ramanagara	0.005	0.041	0.019	0.024	0.060
Chikkamagaluru	0.021	0.035	0.032	0.027	0.063
Vijayapura	0.034	0.054	0.003	0.000	0.064
Bagalkot	0.018	0.046	0.005	0.010	0.060
Uttar Kannada	0.033	0.000	0.004	0.044	0.059
Udupi	0.006	0.035	0.015	0.035	0.061
Mandya	0.011	0.051	0.010	0.026	0.058
Belagavi	0.046	0.045	0.014	0.016	0.065
Bellari	0.026	0.046	0.019	0.020	0.057
Bengaluru Urban	0.000	0.053	0.017	0.041	0.000
Shivamogga	0.026	0.032	0.000	0.035	0.060
Davanagere	0.015	0.044	0.005	0.013	0.062

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Irrigated area(% to GCA)	Cropping intensity (%)	Productivity	Per capita income	Depth of groundwater (mbgl)	Index total
0.049	0.045	0.443	0.046	0.018	0.787
0.041	0.034	0.438	0.051	0.030	0.761
0.038	0.056	0.442	0.045	0.006	0.741
0.032	0.037	0.410	0.048	0.017	0.732
0.027	0.040	0.426	0.050	0.012	0.708
0.032	0.037	0.378	0.042	0.038	0.697
0.035	0.029	0.402	0.046	0.038	0.694
0.012	0.041	0.449	0.014	0.011	0.684
0.041	0.000	0.429	0.041	0.024	0.683
0.028	0.039	0.394	0.048	0.020	0.677
0.029	0.048	0.381	0.046	0.012	0.669
0.034	0.057	0.358	0.037	0.020	0.667
0.040	0.041	0.332	0.051	0.033	0.663
0.023	0.039	0.379	0.049	0.000	0.663
0.025	0.044	0.345	0.040	0.003	0.662
0.026	0.024	0.371	0.045	0.030	0.661
0.019	0.037	0.392	0.044	0.017	0.657
0.023	0.034	0.379	0.051	0.003	0.655
0.034	0.053	0.352	0.039	0.028	0.654
0.036	0.035	0.353	0.029	0.021	0.651
0.025	0.053	0.348	0.050	0.018	0.649
0.014	0.036	0.378	0.041	0.037	0.646
0.024	0.050	0.364	0.043	0.021	0.644
0.027	0.045	0.386	0.024	0.007	0.641
0.005	0.033	0.356	0.039	0.039	0.628
0.011	0.027	0.325	0.049	0.025	0.623
0.014	0.032	0.297	0.040	0.013	0.564
0.029	0.049	0.361	0.000	0.003	0.552
0.000	0.047	0.266	0.036	0.025	0.527
0.012	0.049	0.267	0.048	0.010	0.524

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Table 3: Demographic vulnerability index across the districts of Karnataka

District	Density of male population	Density of female population	Literacy rate of male (%)	Literacy rate of female (%)	Index total
Bengaluru Urban	0.281	0.281	0.015	0.001	0.579
Yadgir	0.006	0.006	0.225	0.212	0.449
Raichur	0.006	0.006	0.165	0.176	0.353
Chamarajanagara	0.003	0.003	0.184	0.145	0.335
Kalaburagi	0.007	0.007	0.137	0.144	0.294
Bellari	0.010	0.010	0.120	0.129	0.270
Vijayapura	0.005	0.005	0.116	0.136	0.262
Ramanagara	0.011	0.012	0.119	0.112	0.255
Koppal	0.007	0.008	0.106	0.132	0.253
Bagalkot	0.010	0.010	0.101	0.128	0.249
Mandya	0.015	0.016	0.108	0.107	0.246
Chikkaballapura	0.011	0.011	0.112	0.112	0.245
Bidar	0.012	0.012	0.102	0.112	0.238
Mysuru	0.022	0.023	0.107	0.085	0.237
Belagavi	0.014	0.015	0.080	0.097	0.206
Kolar	0.016	0.017	0.083	0.086	0.202
Chitradurga	0.004	0.004	0.086	0.091	0.184
Davanagere	0.013	0.013	0.078	0.075	0.179
Tumakuru	0.008	0.008	0.075	0.083	0.174
Gadag	0.006	0.006	0.062	0.093	0.167
Bengaluru Rural	0.020	0.020	0.061	0.067	0.167
Hassan	0.008	0.009	0.069	0.077	0.163
Haveri	0.013	0.013	0.067	0.068	0.160
Dharwad	0.019	0.020	0.049	0.053	0.142
Chikkamagaluru	0.001	0.002	0.056	0.054	0.114
Shivamogga	0.005	0.005	0.052	0.046	0.107
Kodagu	0.000	0.000	0.043	0.030	0.073
Uttara Kannada	0.000	0.000	0.026	0.028	0.055
Udupi	0.011	0.014	0.013	0.013	0.051
Dakshina Kannada	0.018	0.021	0.000	0.000	0.039

227 **Table 4: Composite index of vulnerability**

Sl. No	Districts	Composite index	Sl. No	Districts	Composite index
1	BIDAR	0.677	16	CHAMARAJANAGAR	0.579
2	KOLAR	0.658	17	MYSURU	0.574
3	YADGIR	0.638	18	TUMKUR	0.573
4	KOPPAL	0.636	19	HASSAN	0.571
5	RAICHUR	0.628	20	BENGALURU RURAL	0.558
6	CHITRADURGA	0.628	21	MANDYA	0.557
7	KALABURAGI	0.625	22	BELAGAVI	0.555
8	RAMANAGARA	0.604	23	BALLARI	0.543
9	VIJAYAPURA	0.602	24	BENGALURU URBAN	0.538
10	GADAG	0.599	25	CHIKKKAMAGALURU	0.531
11	DHARWAD	0.596	26	UTTARA KANNADA	0.530
12	KODAGU	0.594	27	DAKSHINA KANNADA	0.528
13	CHIKBALLAPUR	0.593	28	UDUPI	0.486
14	BAGALKOT	0.590	29	DAVANGERE	0.486
15	HAVERI	0.580	30	SHIVAMOGGA	0.440
					Average=0.577

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