
Supplementary information

Oil palm cultivation can be expanded while sparing biodiversity in India

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Supplementary Information for:
“Oil palm cultivation can be expanded while sparing biodiversity in India”

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Supplementary Information 1

Calculating the water footprints of oil palm and rice

Data sources

Crop water requirements (CWRs) were calculated based on data from the years 2000 to 2009. CWRs were split between ‘blue’ and ‘green’ CWRs – green water is supplied through rainfall and blue water through irrigation from surface and groundwater sources¹. Data on precipitation were taken from the Indian Meteorological Department’s 1.0° x 1.0° daily rainfall product². Mean daily temperatures were taken from the University of East Anglia’s Climate Research Unit CRU TS3.10 dataset³. Wind speed and relative humidity data were derived from the National Oceanic and Atmospheric Administration's (NOAA) reanalysis product⁴. Soil information came from the Food and Agriculture Organization (FAO) of the United Nations Harmonized World Soil Database map⁵. Data for net radiation at the surface (which also accounts for soil heat flux density) were taken from the National Aeronautics and Space Administration's (NASA) Global Land Data Assimilation System Noah Land Surface Model L4 monthly 0.25° x 0.25° degree, version 2.0⁶. Crop coefficients, planting dates, growing stages, and climate regions came from [7].

Estimating atmospheric demands on crops

Following [7-9], reference evapotranspiration, ET_o , was calculated at monthly time steps at the district level using the FAO's Penmann Monteith Equation¹⁰:

$$ET_o = \frac{0.408 \Delta (R_n - G) + \gamma \frac{900}{T + 273} u_2 (e_s - e_a)}{\Delta + \gamma (1 + 0.34 u_2)}$$

where R_n is the net radiation at the crop surface ($\text{MJ m}^{-2} \text{ day}^{-1}$), G is the soil heat flux density ($\text{MJ m}^{-2} \text{ day}^{-1}$), T is the mean daily air temperature at 2 meters ($^{\circ}\text{C}$), u_2 is the wind speed at 2 meters (m s^{-1}), e_s and e_a are the saturation and deficit vapor pressures, respectively (kPa), Δ is the slope vapor pressure curve ($\text{kPa } ^{\circ}\text{C}^{-1}$), and γ is the psychrometric constant ($\text{kPa } ^{\circ}\text{C}^{-1}$). To determine crop-specific evapotranspiration (ET_c), ET_o was then multiplied by a crop coefficient, k_c , which is dependent on

the month, planting date of the crop, and growing stage¹¹; Supplementary Table 2). Following [10], Δ , γ , e_s , and e_a were derived from the temperature and relative humidity data listed above.

Solving the soil water balance

We used the WATNEEDS model¹² to solve the soil water balance for oil palm and rice to determine the volume of water (mm yr⁻¹) required to prevent each of these crops from dropping below their respective levels of readily available water (i.e., the level of soil moisture below which a plant can no longer extract water from the soil). Information on soil texture⁵ was used to determine field capacity (i.e., the volume of arriving moisture that can be retained in the soil), wilting point, runoff, and deep percolation¹⁰. If precipitation was insufficient to meet the total CWR (i.e., ET_c), the model added water through irrigation to prevent the crop from dropping below its wilting point. In this way, we were able to determine a ‘green’ CWR (provided by precipitation) and a ‘blue’ CWR (provided through deficit irrigation). After running the model for each time step, we then took a summation of the monthly CWRs to determine total ‘blue’ and ‘green’ crop water requirements for a growing season. In the case of oil palm, this encompassed the whole year. While our calculated CWR values are based on current (2000-2009) climate conditions, recent work has shown that the choice of crop can have a far greater impact on an area’s crop water demand than alterations in precipitation and temperature from climate change¹³. Thus, we do not expect substantial changes in the CWRs of either crop within the future scenarios considered here.

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Table S1 | Potential palm oil yields from areas overlapping with 'marginal' rice production where 'marginal' rice production is defined as < 2 tonnes/ha. Area and yield numbers should be viewed as informed approximations rather than as precise projections.

Climate Change	Irrigation	Inputs	Oil palm cultivable area (M. ha.)	Potential yield (ha⁻¹)	Total yield (M. Tn.)	Potential rice yield loss (M. Tn.)
A2 Scenario	Irrigated	High	16.08	6.78	108.92	18.94
		Medium	16.08	4.37	70.22	18.94
		Low	16.08	2.09	33.53	18.94
	Rain-fed	High	1.41	2.94	4.16	1.74
		Medium	1.52	1.88	2.86	1.84
		Low	3.97	0.57	2.26	4.88
No climate change	Irrigated	High	13.48	6.60	88.96	16.35
		Medium	13.48	4.22	56.94	16.35
		Low	13.48	2.01	27.11	16.35
	Rain-fed	High	1.81	3.33	6.01	2.21
		Medium	1.96	2.12	4.16	2.21
		Low	2.25	1.01	2.27	2.71

Table S2: Total annual water requirement (mm/year) for oil palm and rice cultivation in (a) all areas suitable for oil palm cultivation currently used for rice cultivation (Fig. 1a), and (b) areas of overlap between oil palm suitable areas and 'marginal' rice areas (Fig. 1b).

Scenario	Crop	Blue water	Green water	Total
		(from surface and ground water irrigation)	(from rainfall)	
All areas of oil palm-rice overlap	Oil palm	1225 ± 477	633 ± 352	1858 ± 288
	Rice	333 ± 324	465 ± 245	799 ± 178
Oil palm-marginal rice overlap	Oil palm	1325 ± 498	591 ± 379	1916 ± 261
	Rice	388 ± 347	437 ± 265	823 ± 172

Table S3: List of k_c values for rice and oil palm disaggregated by month and climate zone.

Note that rice is a monsoonal crop (growing season between May and October in most climate zones), while oil palm is a permanent plantation crop.

Crop	Clim	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	Nov	Dec
	Zone												
Rice	1	0	0	0	0	1.05	1.13	1.2	1.2	0.6	0	0	0
	2	0	0	0	0	0	1.05	1.13	1.2	1.2	0.6	0	0
	3	0	0	0	0	0	1.05	1.13	1.2	1.2	1.2	0.6	0
	4	0	0	0	0	1.05	1.13	1.2	1.2	1.2	0.9	0	0
	5	0	0	0	0	1.05	1.13	1.2	1.2	0.6	0	0	0
	6	0	0	0	0	1.05	1.13	1.2	1.2	1.2	0.9	0	0
Oil Palm	1	0.95	0.9	0.9	0.9	0.9	0.93	0.93	0.95	0.95	0.95	0.95	0.95
	2	0.95	0.9	0.9	0.9	0.9	0.93	0.93	0.95	0.95	0.95	0.95	0.95
	3	0.95	0.9	0.9	0.9	0.9	0.93	0.93	0.95	0.95	0.95	0.95	0.95
	4	0.95	0.9	0.9	0.9	0.9	0.93	0.93	0.95	0.95	0.95	0.95	0.95
	5	0.95	0.9	0.9	0.9	0.9	0.93	0.93	0.95	0.95	0.95	0.95	0.95
	6	0.95	0.9	0.9	0.9	0.9	0.93	0.93	0.95	0.95	0.95	0.95	0.95

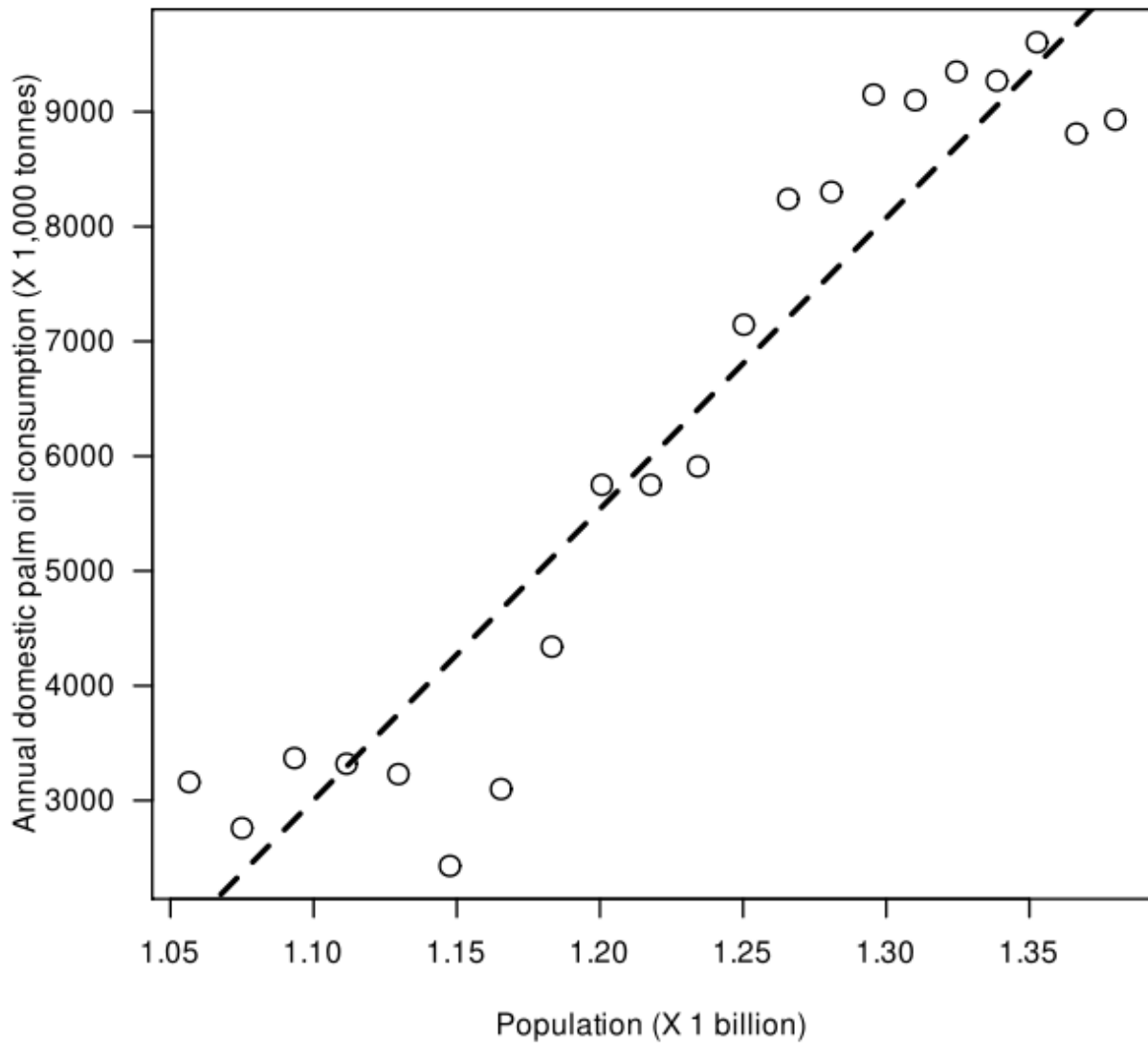


Figure S1 | In India, annual palm oil consumption is strongly positively related to population size (2000-01 to 2019-20). Data are sourced from the Foreign Agricultural Service of the United States Department of Agriculture). The recent decrease in India’s palm oil consumption (top right corner) is because of the ban on imports from Malaysia, highlighting the need for India to enhance self-sufficiency in palm oil production.

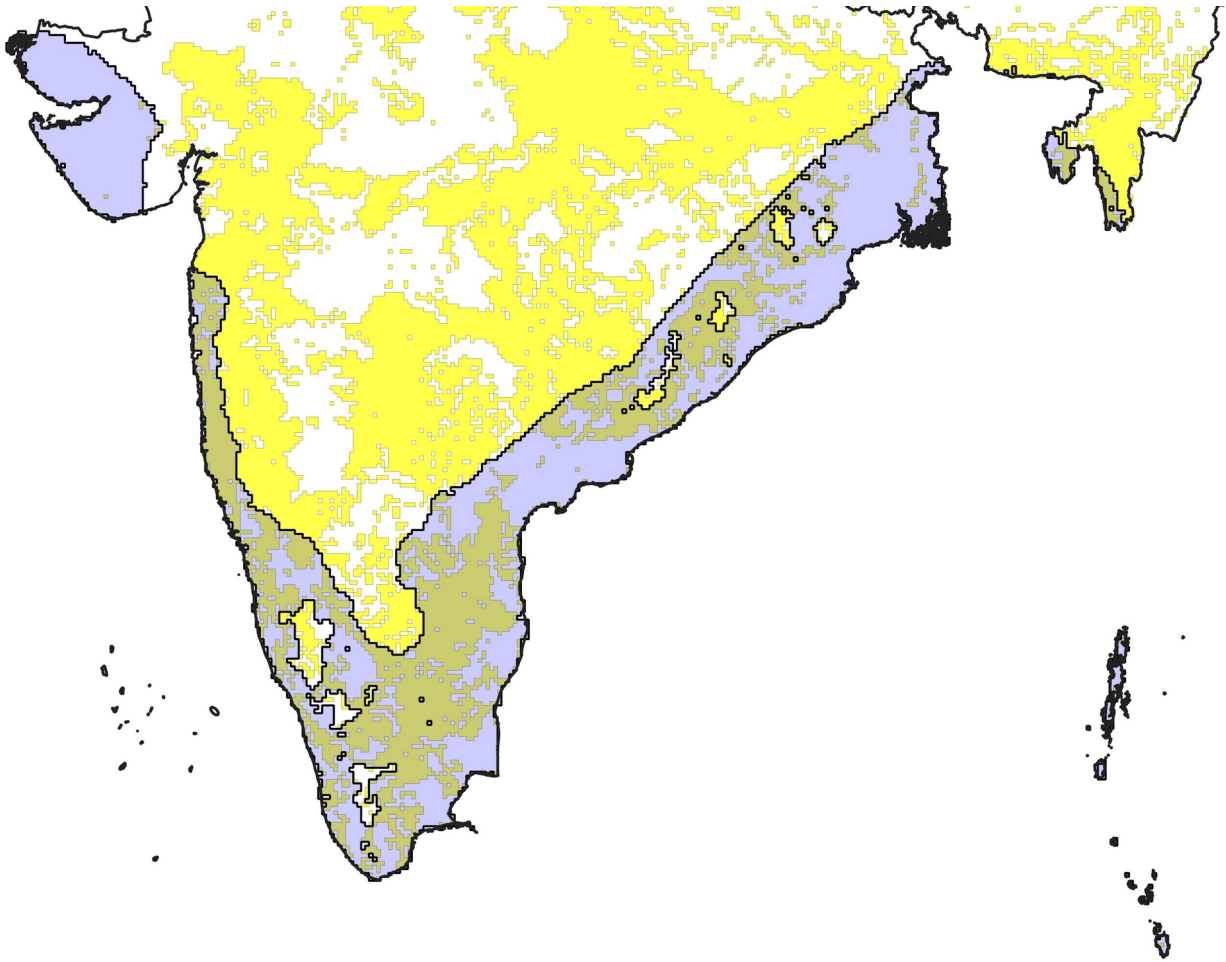


Figure S2 | Overlaps (green) between marginal rice producing regions (yellow) and areas suitable for the cultivation of oil palm under the A2 climate scenario with artificial irrigation and high agricultural inputs (blue outlined in black).

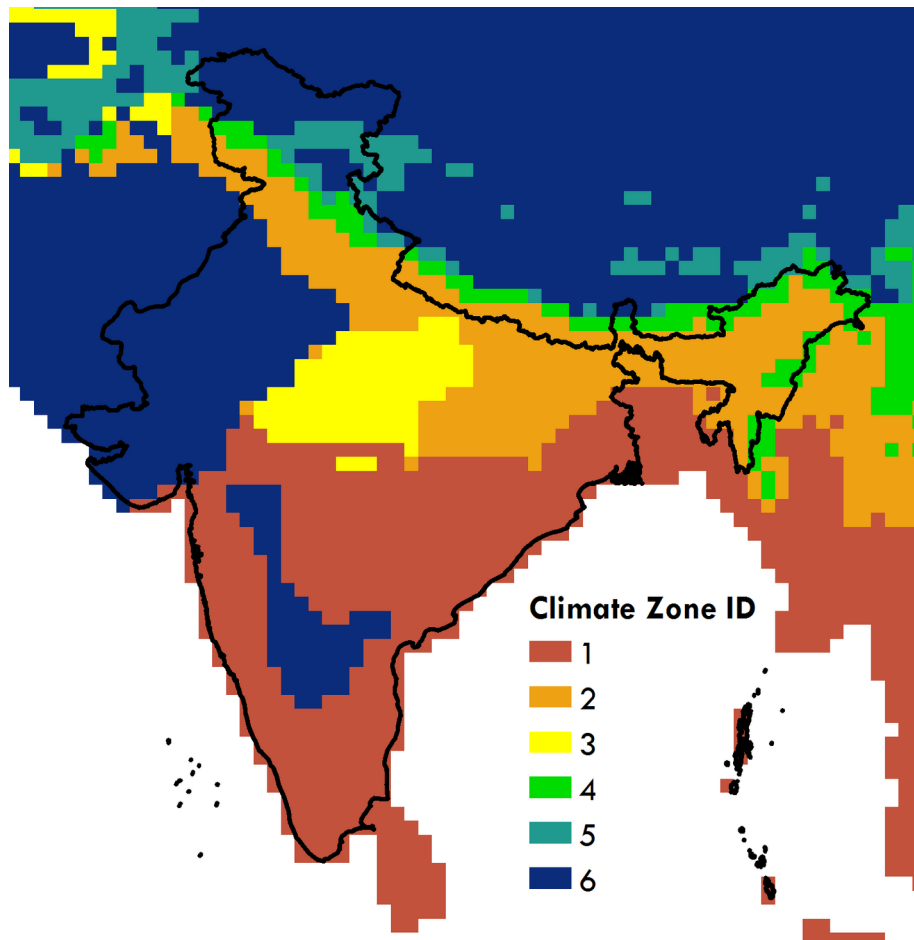


Figure S3 | Map of climate zones based on Kottek et al. 2006. (World map of the Köppen-Geiger climate classification updated. *Meteorologische Zeitschrift* 15: 259-263). Areas suitable for oil palm cultivation in India lie largely in Climate Zone 1 (see Fig. 1).