

Milk will drive methane emissions in India

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Abstract

Livestock is a significant contributor to global anthropogenic emissions of methane, a short-lived greenhouse gas that is responsible for about 20% of the warming induced by greenhouse gases since pre-industrial times. India is a major contributor to these emissions, and its demand for livestock products is continually increasing in response to both growth in incomes and in population. We estimate methane emissions from livestock in India by estimating the demand for milk and milk products using countrywide representative consumption data over the period 1983-2012. We find that the average annual growth rate of methane emissions from dairy cattle is about twice as large (2.4%) as current estimates that do not take into account the economic factors that influence livestock demand. The difference in growth rates translates to an almost 40% difference in forecasted emissions from dairy cattle by 2050. Our findings suggest that, in a rapidly changing economic environment, current forecasts of greenhouse gas emissions from livestock may inaccurately estimate emissions since they fail to consider the economics governing it. We also estimate emissions under different scenarios, in terms of milk price trajectories and livestock composition. The changes in price do not alter our results significantly but the transition to crossbred animals in livestock drastically reduces future methane emissions from milk production.

Key Words: milk — enteric fermentation — methane — global warming — demand system estimation — growth rate of emissions

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33 1 Introduction

34 Globally, the livestock sector accounts for approximately 14.5% of all anthropogenic
35 greenhouse gas emissions (7.1 of 49 Gt CO₂e yr⁻¹) (?). About 44% (3.1 Gt CO₂e
36 yr⁻¹) of the livestock sector's emissions are in the form of methane, the second
37 most important greenhouse gas after carbon dioxide (??). The Global Warming
38 Potential (GWP) of methane is estimated to be 28 for a time horizon of 100 years
39 (?). This means that over a 100 year period a tonne of methane warms the earth
40 28 times more than a tonne of carbon dioxide. From 2003-2012 about 60% of
41 all methane emissions came from anthropogenic source with ruminant production
42 being the largest contributor (??). This is because of enteric fermentation, a diges-
43 tive process in ruminants that releases methane as a by-product (???). Currently,
44 enteric fermentation contributes about 32-40% to global greenhouse gas emissions
45 from agriculture and over 90% of the enteric emissions are from cattle and buffaloes
46 (?).

47 Present estimates of methane emissions from livestock are obtained by multi-
48 plying animal populations with animal specific emission factors (????). Forecasts
49 of emissions are simply based on trends in the number of animals that do not take
50 into account economic factors such as income and population growth that determine
51 the demand for livestock products. However, in major contributors to emissions,
52 such as India, (contributes about 13% to global methane emissions from livestock)
53 there is an explosive growth in demand for livestock products due to rising incomes
54 and a higher population (???). Using India's National Sample Survey data we es-
55 timate that between 1983-2012 the total number of households that consume milk
56 increased from about 79.5 million to 185 million, an increase of 133% (see *SI*, Fig-
57 ure S1). Monthly household expenditure, a proxy for household income, increased
58 by 37% over the same period. If these trends continue in the future, we forecast
59 that by 2050 the monthly consumption expenditure of an average household will
60 go up by another 35%. The number of milk consuming households will increase to
61 almost 349 million. This increase in milk consumption has the potential to signifi-
62 cantly influence greenhouse gas emissions of India.

63 Our goal is to estimate methane emissions from livestock in India taking into
64 account the changing economic environment that determines the consumption of
65 livestock products. We approach this in two steps. First, we use countrywide repre-
66 sentative household consumption survey data over the period 1983-2012 to estimate
67 the demand of milk and milk products. Second, we use the estimated demand func-

68 tion to predict India’s milk consumption and the resulting methane emissions in the
69 near future. We focus on milk because income from the sale of milk is the primary
70 determinant of the size of the livestock in India. Farmers own cattle largely due to
71 earnings from milk (see *SI*, Table S1). There are no beef farms in India (?). Most
72 of the beef produced is sourced from culled and spent cattle and buffalo in the dairy
73 industry. The non-viability of male cattle is reflected in their numbers in the live-
74 stock population. The share of males in the total population of cattle and buffaloes
75 was about 28% in 2012, the latest year in which the livestock census was conducted
76 in India (see *SI*, Table S2).

77 The data we use to estimate milk consumption is from a sample of about eight
78 hundred thousand Indian households over the period 1983-2012. The households
79 are respondents in a survey conducted by the National Sample Survey (NSS). This is
80 a repeated cross-section of nationally representative household survey data. The de-
81 mand estimation is done using the Quadratic Almost Ideal Demand System (QUAIDS)
82 developed by (?). The estimated milk consumption is converted to corresponding
83 methane emissions by using estimates of emissions per unit milk from ?. We com-
84 bine the estimates of the parameters of the milk demand function with trends in all
85 the variables in the milk demand function to predict India’s milk consumption till
86 2050.

87 Finally, we examine the potential of reducing methane emissions from livestock
88 by changing its composition. We develop two scenarios for which we estimate
89 future methane emissions due to milk consumption. The first assumes that all milch
90 animals have been replaced by buffaloes and the second assumes that all animals
91 have been replaced by crossbred cattle.

92 The following section describes the data sources. Results of milk demand esti-
93 mation are presented in Section 3. Section 4 discusses estimates of methane emis-
94 sions from future milk consumption. The effect of livestock composition on emis-
95 sions is explored in Section 5. Section 6 shows how emissions respond to changes
96 in the price of milk and Section 7 concludes with implications and limitations of
97 our findings.

98 **2 Data**

99 The data on household consumption is taken from surveys conducted by the Na-
100 tional Sample Survey Organisation (NSSO). This is a quinquennial survey of rural
101 and urban households from all regions of India. We use data from all the seven large

102 rounds conducted between 1983-84 (38th Round) and 2011-2012 (68th Round).
103 Households are asked to recall expenditure incurred and quantities purchased on
104 most items of domestic consumption.

105 Total expenditure on any item includes money spent on purchase and value of
106 consumption out of home production. The latter is valued at the average retail prices
107 prevailing in the household's district of residence. In order to make expenditure
108 and prices comparable across rounds we use industrial and agricultural consumer
109 price indices reported by the Labour Bureau of India to deflate or inflate to 2004
110 equivalent values.

111 The survey also collects information on several household-level demographic
112 and economic characteristics. Data on household income is not collected. There-
113 fore, we use total monthly consumption expenditure as a proxy for total income.
114 Summary statistics for all the variables used in our demand estimation are presented
115 in *SI* Figure S1, Figure S2, Figure S3 and *SI* Table S3.

116 District-level data from 19 states on livestock population was obtained from the
117 ICRISAT VDSA (Village Dynamics in South Asia) unapportioned Meso database
118 (?) for the years 2003, 2007 and 2012. These 19 states account for about 90% of
119 the geographical area of India. This dataset provides the number of cattle by cattle
120 type, gender and also the numbers by age and milk producing status.

121 **3 QUAIDS Model**

122 The demand of milk was modeled using the Quadratic Almost Ideal Demand Sys-
123 tem (QUAIDS) developed by ? (see *SI*). We estimate the consumption of liquid
124 milk as well as the consumption of milk products i.e. curd and ghee (Indian pro-
125 cessed butter). All other consumption items (food and non-food) are combined into
126 a single composite commodity representing other consumption.

127 We chose the QUAIDS model because it belongs to the class of demand sys-
128 tems that can generate income elasticities that vary with income while allowing
129 for price effects that are consistent with utility maximization. Hence, it is capa-
130 ble of generating the quadratic Engel curves (the relationship between expenditure
131 on a commodity and income) that we observe in the data (see *SI*, Figure S4). We
132 estimate the parameters of the demand system by iterated feasible generalized non-
133 linear least-squares method. The estimation was done in the software Stata using
134 the program developed by ?.

135 **3.1 Results of the QUAIDS Model**

136 Figure 1 shows the non-parametric plot of price elasticity of demand of milk against
137 total monthly consumption expenditure of the household. The price elasticity of de-
138 mand of milk is relatively high for the poor. The magnitude of elasticity falls from
139 around 0.5 to 0.35 over the distribution of consumption expenditure. The estimates
140 of expenditure elasticity of demand are to be interpreted as the percentage change
141 in share of expenditure on an item by the household in response to a 1% change
142 in household monthly consumption expenditure. We find that the expenditure elas-
143 ticity of demand of milk is very high at low levels of consumption expenditure but
144 it falls quite rapidly with an increase in consumption expenditure (see *SI*, Table
145 S4) and Figure 2). The expenditure elasticity of demand of curd also falls with an
146 increase in consumption expenditure but the decrease is much smaller than the de-
147 cline in the expenditure elasticity of milk (see *SI*, Figure S5). On the other hand, the
148 expenditure elasticity of demand of ghee increases with an increase in consumption
149 expenditure (see *SI*, Figure S6). This is expected as unlike milk ghee is a normal
150 good.

151 In order to ensure that the results are robust to model specification, 4 types of
152 QUAIDS model were estimated (see *SI* Table S4). The numbers in *SI* Table S4
153 imply that once we control for the fact that households choose whether to consume
154 a food item or not (see *SI* Columns 2-4 Table S4), the results are stable.

155 **3.2 Extrapolating Milk Demand**

156 To forecast milk consumption, we use the trends observable in the data to estimate
157 the values of all the variables in the demand function of a representative household
158 for each year from 2012-2050. The future values of the price, consumption expen-
159 diture and household size variables are estimated by fitting a linear trend model.
160 The linear trend model is a good approximation of the actual data (see *SI*, Figure
161 S7 and Figure S8). Also, due to the limited number of time periods in the data
162 there is a possibility of over-fitting with more flexible specifications. All the other
163 variables in the demand system are modeled with either a linear trend or no trend.
164 We check if the data supports a linear trend for each of these variables. If there is
165 no significant trend we assume that the mean of the variable for all the years in the
166 sample will be a good prediction of its future value.

167 The predicted values of these variables was then combined with the estimated
168 parameters of milk demand to compute the future consumption of milk, curd and

169 ghee of a representative household. Thus, we assume that the underlying parameters
170 of the demand function are time invariant. Total milk demand was calculated by
171 converting the quantities of curd and ghee to liquid milk.

172 The expenditure elasticity of milk demand is decreasing slowly in the future
173 (see Figure 3). This is not surprising since the population is getting richer and milk
174 is a necessary consumption good. However, the elasticity is still positive and it falls
175 very slowly.

176 Assuming that herd composition and methane emission per kilogram of milk per
177 animal in the area of the residence of the household do not vary with consumption
178 expenditure of the household in a given year, the expenditure elasticity of methane
179 emission for that year equals the expenditure elasticity of demand of milk. Since the
180 methane emission conversion factor is invariant to household consumption expen-
181 diture, it does not affect the expenditure elasticity which is a ratio of proportionate
182 changes. Of course, herd composition and hence methane emissions would change
183 over time. We account for this by using trends in the emission factor.

184 **4 Methane Emissions from Milk**

185 Methane emission factors per kg of milk per animal were taken from the study by
186 ?. The authors' develop India specific emission factors for livestock that take into
187 account the difference in rearing practices in India in comparison to the developed
188 countries. Emission factors are available for three types of cattle i.e. indigenous,
189 crossbred and buffalo. In the data we cannot observe the type of cattle that produces
190 the milk consumed by a household. So we approximate it by using a weighted
191 average of the three emission factors, the weights being the proportion of female
192 cattle of the corresponding type in the district of residence of the household. These
193 data are only available for three years (2003, 2007, 2012) and 19 states, so the
194 methane emission conversion factor was computed for this sub-sample of the data.

195 **4.1 Extrapolating Methane Emissions from Milk Consumption**

196 We use a linear trend in the methane conversion factor to predict values of emis-
197 sion factors for the future representative agent. The predicted milk consumption
198 is then multiplied by the predicted methane emission factor to estimate the pre-
199 dicted methane emissions of a household (see *SI*, Figure S9). The country-level
200 future methane emissions due to milk consumption were calculated by multiplying

201 the methane emissions of a future representative household with the predicted total
202 number of households. The predicted number of households is estimated by fitting
203 a linear trend model to the number of households in the whole country in each year
204 of the NSS survey.

205 Figure 4 shows that even though the average milk consumption of a household
206 increases slightly (see Figure S9 in *SI*), the total consumption of milk increases by
207 a much larger magnitude as more and more households start consuming milk and
208 more households start existing each year.

209 Results indicate that between 2012 and 2050 methane emissions from milk pro-
210 duction in India will more than double from about 2.19 ± 0.01 (95% CI) million
211 tonnes to 5.45 ± 0.08 million tonnes in 2050 (see Figure 4). This amounts to an
212 annual growth rate of about 2.4% and it is much higher than other projections of
213 emissions from enteric fermentation. The closest comparable figure to our estimate
214 is FAO's (Food and Agriculture Organisation of the United Nations) widely used
215 country-wise estimate of methane emissions from enteric fermentation from dairy
216 cattle for each year till 2014 and projections for 2030 and 2050. FAO's data implies
217 a growth rate of just about 1.1% in enteric emissions from dairy cattle in India over
218 the period 2012-2050. Both the set of estimates are plotted in Figure 5. We find
219 that FAO might underestimate future enteric emissions due to milk by almost 40%
220 in 2050. And as is evident from Figure 5 this underestimation increases the further
221 we go in time.

222 Figure 5 also shows that in the initial years of the forecast our estimate of emis-
223 sions is lower than that of the FAO. This gap widens as we go further in time be-
224 cause of the higher growth rate in emissions due to milk consumption estimated by
225 our model. The difference in the magnitude of emissions during the initial years
226 may be because of the fact that FAO uses higher emission factors compared to the
227 India specific emission factors given by ? that we use in the analysis. Further, we
228 calculate emissions from liquid milk, curd and ghee consumption in India. Data
229 limitations did not allow us to account for the demand for milk through the con-
230 sumption of milk products such as ice-creams and cheese. Ideally, we would have
231 liked to include the demand for these milk products in the analysis. However, we
232 cannot estimate this demand because there are a variety of ice-creams sold in India
233 and the data does not let us identify the type of ice-cream bought by a consumer.
234 The NSS also does not have data on the consumption of cheese.

235 The difference between our forecast of enteric emissions due to milk production
236 and that of the FAO is primarily due to the difference in approach. Our forecast is

237 based on a model of milk demand that takes into account its determinants such as
238 income. FAO on the other hand predicts the quantity of livestock and the resulting
239 methane emissions by simply estimating a trend in the size of the livestock. FAO's
240 supply side approach therefore does not account for the growth in milk demand that
241 is likely to spur growth in livestock in India.

242 **5 The impact of changing the composition of live-** 243 **stock on methane emissions**

244 Crossbred cattle emit the lowest amount of methane per unit of milk (?). In India
245 there has been a gradual increase in the number of crossbred female cattle (see
246 *SI*, Table S2). The effect of this increase may get nullified by an increase in the
247 total volume of livestock needed to meet the increased milk demand. To see which
248 of these effects dominate, we estimate future methane emissions in India under two
249 scenarios. The first assumes that all animals have been replaced by buffaloes and the
250 second assumes that they have been replaced by crossbred cattle. We find that the
251 rise in emissions will be significantly lower if all the milch animals are replaced by
252 crossbred cattle (see Figure 6). Methane emissions from milk would have increased
253 to about 3.66 ± 0.06 million tonnes in 2050 under this scenario (see *SI* Figure S10).
254 Therefore, emissions would be lower by 33% in 2050 compared to the scenario in
255 which livestock grows according to the current trends in the data.

256 **6 Testing Sensitivity to the Price of Milk**

257 So far we have assumed that the quantity of milk in equilibrium will be determined
258 by its demand. Supply is able to cater to whatever quantity is demanded. This may
259 not be an unreasonable assumption because in India the supply of milk has been
260 able to meet the increasing demand of milk and is expected to do so in the future
261 (???). Any mismatch in the demand and supply of milk is reflected in the price of
262 milk. We therefore estimate the historical retail price of milk in the data and find
263 that over the period 1983-2012 the real retail price of milk increased marginally
264 (see *SI*, Figure S1). Recent data from other sources on the inflation adjusted retail
265 price of milk in major markets in India also implies that the price increase has
266 been very small. The real retail price of milk increased annually by just 0.9% from
267 2009-2016 (?). However, the wholesale inflation adjusted price of milk in India

268 has increased by about 40% from 2008-2016 (?). The reason for this divergence
269 between the wholesale price of milk and the retail price of milk is not clear. Further,
270 the authors' project milk production in India till 2025-26 under two scenarios using
271 the year 2012-2013 as the base year of the projections (?). The findings from the
272 scenario that reflects the longer-term trend in livestock over the period 1997-2012
273 suggest that India can sustain growth in milk production in the near future. Key to
274 this outcome, is likely to be the continued expansion of crossbred cattle, projected
275 to remain the fastest growing segment of the population. In another study that
276 predicts milk consumption in India till 2026-27, the authors' conclude that given
277 current trends in milk production India can meet the projected increase in milk
278 demand (?). But the authors' mention that any decline in the rate of growth of milk
279 production could lead to an increase in the price of milk and milk products.

280 In our analysis the price of milk is assumed to follow a linear trend. To see
281 how milk consumption will change if the price of milk increases faster than that
282 predicted by the trend, we estimate milk demand under 3 scenarios of price change
283 (see *SI*, Figure S12 and Figure S13). The effect of the higher price trajectories on
284 methane emissions is shown in *SI*, Figure S14. We find that methane emissions do
285 not decrease significantly in response to higher prices. Even under the assumption
286 that prices grow thrice as fast as the current trend, emissions reduce by just about
287 11% from 5.45 million tonnes to about 4.88 million tonnes in 2050.

288 **7 Discussion and conclusions**

289 The principal finding from this paper is that if current trends in the determinants
290 of milk demand and the composition of livestock continue methane emissions from
291 milk production in India would more than double from about 2.19 ± 0.01 million
292 tonnes in 2012 to 5.45 ± 0.08 million tonnes in 2050. This leads to an average
293 annual growth rate of 2.4% and it is much higher than other projections of India's
294 emissions from enteric fermentation. In its latest communication to the United Na-
295 tions Framework Convention on Climate Change (UNFCCC), India reported methane
296 emissions in 2010 of about 10.8 million tonnes attributable to enteric fermentation.
297 Using this estimate and assuming that emissions from livestock other than dairy cat-
298 tle would also grow by 2.4% per year, enteric emissions in India would amount to
299 about 27.5 million tonnes by 2050. This growth of methane emissions from enteric
300 fermentation has huge implications for the environment. Not only is methane a far
301 more potent greenhouse gas than carbon dioxide, it also has several other negative

302 impacts on the environment. For example, it leads to increased formation of ozone
303 in the troposphere that can reduce agricultural yields. Methane's reaction with hy-
304 droxyl reduces the amount of that chemical available to create cooling sulphate
305 aerosols and more warming. It can also form water vapour another greenhouse gas
306 (?).

307 We obtain higher estimates of methane emissions from livestock than previ-
308 ous forecasts because our estimation approach focuses on the demand of livestock
309 products that in turn drives the demand of livestock. On the other hand previous
310 approaches estimate enteric emissions by estimating the trend in the number of an-
311 imals (?). They do not take into account the factors that impact herd size. Such
312 approaches therefore, cannot predict how emissions will respond to changes in the
313 market for livestock products.

314 Although India is the largest producer of milk in the world and it also has the
315 largest population of cattle in the world, Indian milk yields are much lower than
316 yields in the advanced dairy economies (?). So a natural way to reduce emissions
317 from India's dairy sector is by improving the productivity of Indian livestock. We
318 explore the impact of such changes by estimating methane emissions under sce-
319 narios where the entire livestock has been replaced by either crossbred cattle or
320 buffaloes. We indeed find that the rise in future emissions would be significantly
321 lower if all the milk is produced by high-yielding crossbred cattle.

322 The findings imply that the growth in enteric emissions in India would be much
323 higher than what has been projected till now. Further, ? find that climate change has
324 adversely affected the productivity of Indian livestock. This implies that with rising
325 temperatures more and more milch animals may be required to meet milk demand.
326 This in turn would lead to a further increase in methane emissions than what we
327 estimate and consequently more global warming.

328

329 8 References

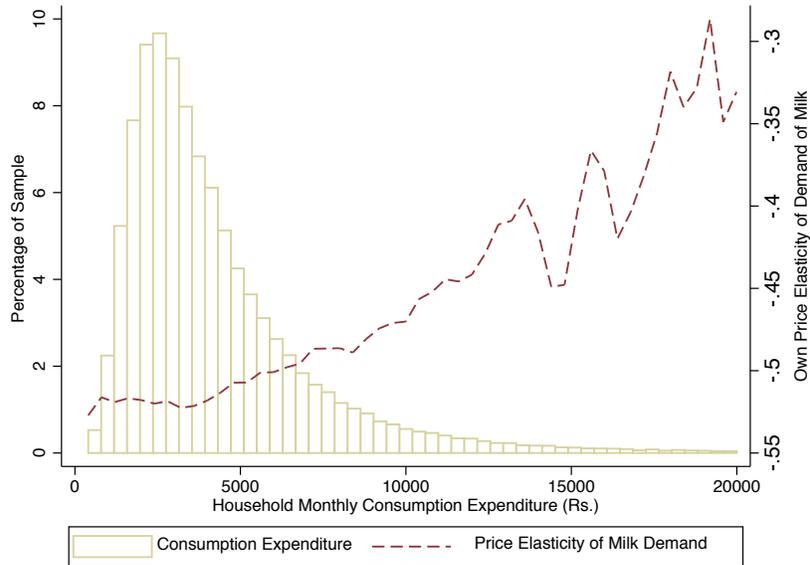
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Figure 1: Own Price Elasticity of Demand of Milk

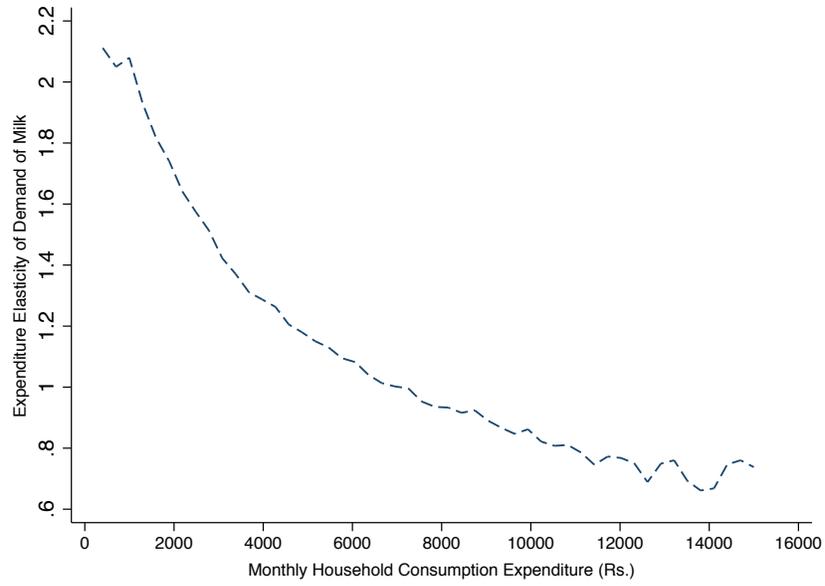


Notes: Non-parametric plot of own price elasticity of demand of milk and monthly household consumption expenditure.



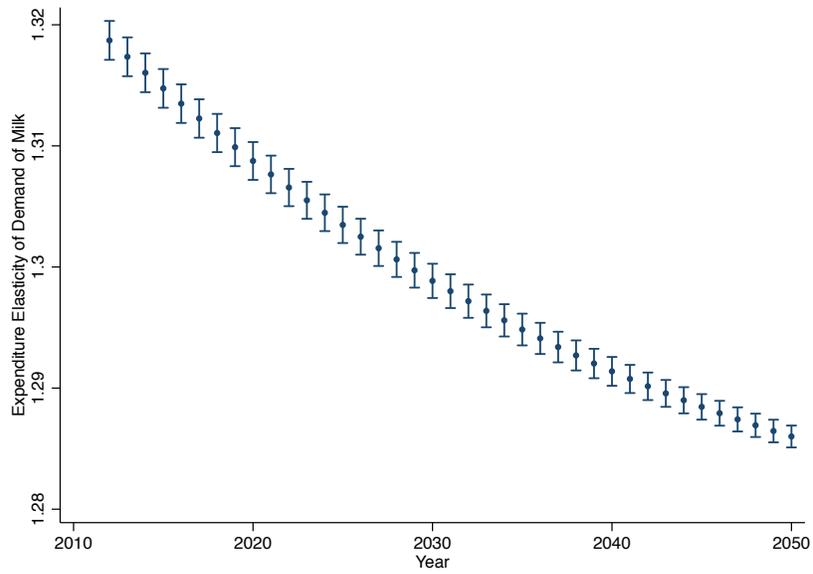
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Figure 2: Expenditure Elasticity of Demand of Milk



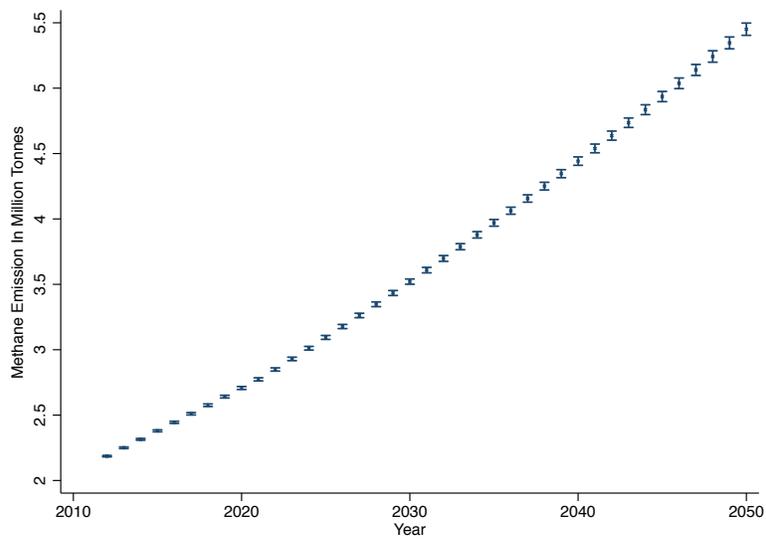
Notes: Non-parametric plot of expenditure elasticity of demand of milk and monthly household consumption expenditure.

Figure 3: Predicted Expenditure Elasticity of Demand of Milk



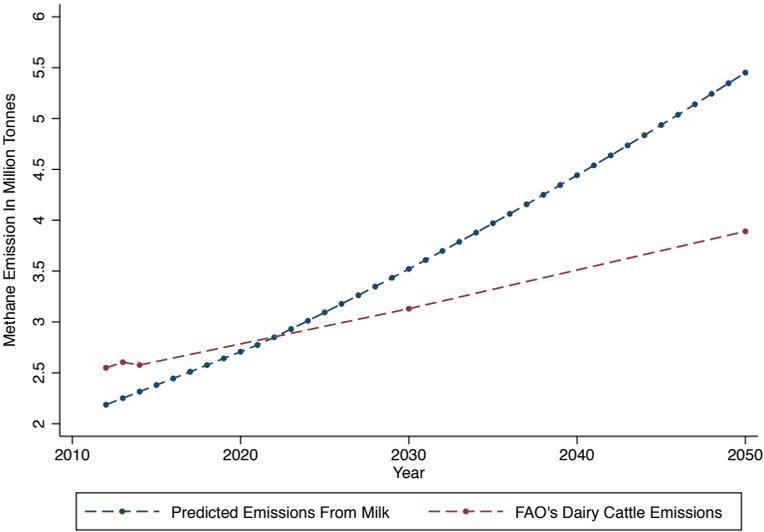
Notes: Figure plots the predicted expenditure elasticity of demand of milk of a representative household for the years 2012-2050. The bars indicate the 95% confidence interval.

Figure 4: Predicted Methane Emissions from Milk Consumption in India



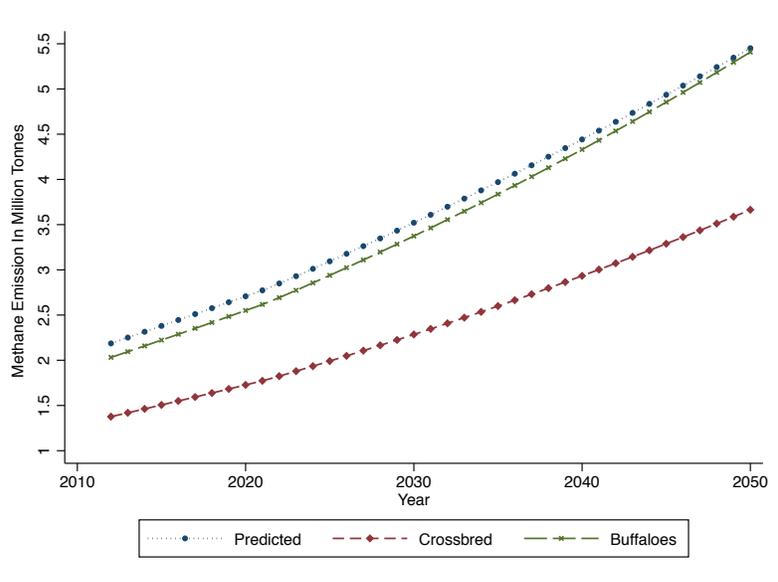
Notes: Figure plots the total emissions due to milk consumption in India from 2012-2050. The bars indicate the 95% confidence interval. Emissions are reported in million tonnes.

Figure 5: Comparison of Methane Emissions from Enteric Fermentation in India



Notes: Figure plots methane emissions due to milk consumption in India from 2012-2050 and by the FAO. Emissions are reported in million tonnes.

Figure 6: Predicted Methane Emissions: Alternative Scenarios



Notes: Figure plots the trajectory of emissions from 2012-2050 under three scenarios. The blue solid line represents the scenario in which the current trends in the composition of livestock are assumed to continue. The red dashed line represents the scenario in which all the milk producing livestock is made up of crossbred cattle. And the green long dashed line represents the scenario in which milk is produced only by buffaloes. Emissions are reported in million tonnes.