

1 Comment on “Hydrocarbon emissions
2 characterization in the Colorado Front Range — A
3 Pilot Study”

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5 **Abstract.** *Petron et al.* [2012] have recently observed and analyzed alkane
6 concentrations in air in Colorado’s Weld County and used them to estimate
7 the volume of methane vented from oil and gas operations in the Denver-
8 Julesburg Basin. They conclude that “the emissions of the species we mea-
9 sured are most likely underestimated in current inventories”, often by large
10 factors. However, their estimates of methane venting, and hence of other alkane
11 emissions, rely on unfounded assumptions about the composition of vented
12 natural gas. We show that relaxing those assumptions results in much greater
13 uncertainty. We then exploit previously unused observations reported in *Petron*
14 *et al.* [2012] to constrain methane emissions without making assumptions about
15 the composition of vented gas. This results in a new set of estimates that are
16 consistent with current inventories but inconsistent with the estimates in *Petron*
17 *et al.* [2012]. The analysis also demonstrates the value of the mobile air sam-
18 pling method employed in *Petron et al.* [2012].

1. Introduction

19 Several studies reporting unexpectedly high methane leakage from natural gas opera-
20 tions have recently attracted attention and sparked debate [*Howarth et al.*, 2011; *Jiang et*
21 *al.*, 2011; *Cathles et al.*, 2011]. *Petron et al.* [2012] (henceforth P12) have now attempted
22 to infer rates of methane emissions from oil and gas operations in the Denver-Julesburg
23 Basin directly from novel measurements of alkane (notably methane and propane) concen-
24 trations in air near those operations. They report much higher rates of methane emissions
25 than have been previously estimated through bottom up methods based on industry in-
26 ventories. Here, we show that their results rely on unsupported assumptions about the
27 molecular composition of vented natural gas. We then use additional observations re-
28 ported (but not exploited) in P12 to estimate the rate of methane leakage without resort
29 to assumptions about the composition of vented methane gas. Our conclusions are con-
30 sistent with the more modest emissions rates indicated by bottom-up inventories but not
31 with the top-down estimates presented in P12. In addition, our emissions estimates could,
32 in principle, be further constrained by additional observations.

2. Method of P12

33 P12 analyze alkane concentrations in air samples collected both by the National Oceano-
34 graphic and Atmospheric Administration (NOAA) Boulder Atmospheric Observatory
35 (BAO) and by mobile air surveys in the Denver-Julesburg Basin area. The former finds a
36 C_3H_8 -to- CH_4 (C_3/C_1) molar ratio of 0.104 ± 0.005 for summertime samples (0.105 ± 0.004
37 for wintertime) originating near oil and gas producing areas, while the latter finds a C_3/C_1

38 molar ratio of 0.095 ± 0.007 . The authors use a C_3/C_1 ratio of 0.1 in their subsequent
 39 analyses.

40 To estimate methane leakage based on their air observations, the authors begin by noting
 41 that most observed alkane emissions come from either raw gas venting or condensate tank
 42 flashing. They then create two equations. The first describes the vented gas:

$$43 \quad v_{m/p} = \frac{M_p x_m}{M_m x_p} \quad (1)$$

44 where $v_{m/p}$ is the basin-average C_1/C_3 molar ratio of vented raw gas, $M_p = 44g/mol$ and
 45 $M_m = 16g/mol$ are the molar masses of C_3H_8 and CH_4 respectively, x_m is the mass of
 46 methane vented, and x_p is the mass of propane vented.

47 The second relates emissions to observed concentrations of CH_4 and C_3H_8 :

$$48 \quad \frac{M_p(x_m + y_m)}{M_m(x_p + y_p)} = a_{m/p} \quad (2)$$

49 where y_m is the mass of methane released by flashing, y_p is the mass of propane released
 50 by flashing, and $a_{m/p} = 10$ is the observed ratio of CH_4 to C_3H_8 in air.

51 These are solved thusly:

$$52 \quad x_p = \frac{a_{m/p}y_p - y_m M_p / M_m}{v_{m/p} - a_{m/p}} \quad (3)$$

$$53 \quad x_m = v_{m/p} \frac{x_p M_m}{M_p} \quad (4)$$

55 The authors use three different values for $v_{m/p}$ to evaluate equations 3 and 4: (1)
 56 18.75, which is the mean value of $v_{m/p}$ used in the Western Regional Air Partnership
 57 (WRAP) Phase III inventory of oil and gas emissions in the Denver-Julesburg Basin; (2)
 58 15.43, which is the median of the molar ratios of methane to propane in seventy seven
 59 wells studied by the Colorado Oil and Gas Conservation Commission (COGCC) Greater
 60 Wattenberg Area Baseline Study (henceforth referred to as the GWA survey); and (3)

61 24.83, which is the mean of the molar ratios for the same seventy seven wells. For each
62 of these, P12 evaluate x_p and x_m for each of 16 pairs of Y_m and Y_p , each of which is
63 based on an observed profile of flashed gas for a single condensate tank. (This data is
64 provided to them by the Colorado Department of Public Health and the Environment
65 (CDPHE); it has been provided to the present author by the Western Energy Alliance,
66 personal communication.) This gives them minimum, maximum, and average (across all
67 16 flashing profiles) levels of methane venting for each of the three values for $v_{m/p}$. The
68 authors also create bottom-up estimates of methane venting based on figures from the
69 WRAP Phase III study.

70 Table 1 reproduces relevant results from Table 4 of P12. Columns 2 and 3 in Table 4
71 have been reversed in the original paper, which is corrected here. As emphasized in P12,
72 estimates for methane venting done through the top-down method are much higher than
73 the bottom-up ones.

3. Methodological Limitations

74 There is, however, no reason given for believing that the three values of $v_{m/p}$ used in
75 P12 actually bracket the possible range of C_1/C_3 ratios that might characterize vented
76 gas. Indeed the results in P12 suggest that the choice of potential values for $v_{m/p}$ may be
77 incorrect.

78 There is no overlap between the ranges of possible methane emissions estimated from
79 the bottom up and the top down solely using WRAP III figures. This can only be true if
80 either the choice of $v_{m/p}$ is wrong or if some of the underlying WRAP III figures themselves
81 are incorrect; neither allows one to give credence to this particular top-down estimate.

82 That said, the top-down estimates based on the GWA survey do not rely on the WRAP
83 III-based assumption about the value of $v_{m/p}$. They thus have the potential to provide
84 independent insight into methane venting. However, P12 rely on an assumption that the
85 molar ratio of CH_4 to C_3H_8 in vented gas is equal to either the median of that ratio in the
86 77 wells in the GWA survey (Case 2 above, $v_{m/p} = 15.43$) or the average of those wells
87 (Case 3, $v_{m/p} = 24.83$). But the authors make no contention that the 77 wells sampled in
88 the GWA survey are representative of producing wells in Weld County. Moreover, and
89 most importantly, there is no reason to assume that the typical venting-prone well has
90 $v_{m/p}$ bounded by the median and mean for all 77 wells.

91 Indeed the full range of wells sampled show $v_{m/p}$ ranging from 4.11 to 260.2; ninety
92 percent of the wells have $v_{m/p}$ between 8.79 and 61.7. Applying formulas 3-4 above to-
93 gether with lower bound for flashing emissions (reported in P12) yields a lower bound on
94 methane venting emissions of 48 Gg/yr, well below any of the uncertainty ranges reported
95 for the top-down estimates in P12. Moreover, even if one uses the average over the full
96 ensemble of condensate tank flashing profiles reported, instead of the minimum, the es-
97 timated lower bound on methane venting emissions is 66 Gg/yr, still outside any of the
98 uncertainty ranges reported for the top-down estimates in P12. Meanwhile, combining
99 the observations of $a_{m/p}$ used in P12 with the full range of $v_{m/p}$ that characterizes po-
100 tential venting-prone wells, yield no upper bound on methane venting emissions. Indeed
101 it is entirely plausible that venting is biased toward wells with either high or low $v_{m/p}$,
102 since those tend to characterize different types of production wells (gas and oil wells,
103 respectively). The upshot is that, absent difficult to support assumptions about the com-

104 position of vented natural gas, the top-down methods used in P12 give no new constraints
 105 on methane emissions.

4. Constraining Methane Emissions

106 While P12 use only the observed C_1/C_3 ratio to constrain methane emissions, they note
 107 that the observed C_1/nC_4 (methane-to-butane) ratio can be used to do the same thing.
 108 In this section, we combine the observed C_1/C_3 and C_1/nC_4 ratios to remove the need to
 109 make assumptions about $v_{m/p}$, and hence better constrain estimates of methane emissions.

110 As in P12, we have

$$111 \quad X_m/X_p = v_{m/p} \quad (5)$$

$$112 \quad \frac{X_m + Y_m}{X_p + Y_p} = a_{m/p} \quad (6)$$

114 where we have defined $X_i = x_i/M_i$ for all species i in order to simplify our equations.

115 In addition, we have two similar constraints related to observed butane levels:

$$116 \quad X_m/X_b = v_{m/b} \quad (7)$$

$$117 \quad \frac{X_m + Y_m}{X_b + Y_b} = a_{m/b} \quad (8)$$

119 where $v_{m/b}$ is the ratio of methane to butane in vented gas, X_b is the number of moles of
 120 butane vented, Y_b is the number of moles released through condensate tank flashing, and
 121 $a_{m/b}$ is the observed ratio of methane to butane in air. We also define $a_{b/p} = a_{m/p}/a_{m/b}$.

122 To avoid the assumptions made in P12 about the composition of vented gas, we let

$$123 \quad v_{m/p} = \sum_N Q_N v_{m/p}^N \quad (9)$$

$$124 \quad v_{m/b} = \sum_N Q_N v_{m/b}^N \quad (10)$$

126 where N is an index that ranges over all wells, Q_N is the fraction of total venting due to
 127 well N , $v_{m/p}^N$ is the ratio of methane to propane in well N , and $v_{m/b}^N$ is the ratio of methane
 128 to butane in well N .

C_1/C_3 and C_1/nC_4 are consistently correlated in the 77 wells sampled in the GWA
 assessment [COGCC, 2007]. Specifically, if

$$v_{m/b}^N = bv_{m/p}^N, \quad (11)$$

129 we can estimate $b = 4.15 \pm_{1.65}^{2.43}$ (95 percent confidence interval). In obtaining these values,
 130 we discard one outlying well for which C_1/C_3 (260) and C_1/nC_4 (2277) are much greater
 131 than for all other wells. (This observation indicates unusually dry gas for the area under
 132 investigation.) One can obtain a slightly better fit, and hence sharper constraints on X_i ,
 133 by introducing a constant term in equation (11). Doing so, however, makes the analysis
 134 below considerably more complex and opaque while producing similar results.

135 Equation 11 can be substituted in equation 10, which can then be combined with
 136 equation 9 to yield

$$v_{m/b} = bv_{m/p} \quad (12)$$

138 Equations 5-8 and 12 can now be combined to yield

$$X_p = \frac{Y_b - Y_p a_{b/p}}{a_{b/p} - 1/b} \quad (13)$$

$$bX_b = X_p \quad (14)$$

$$X_m = a_{m/p} \frac{bY_b - Y_p}{ba_{b/p} - 1} - Y_m \quad (15)$$

144 At a similar point in the P12 analysis, the authors continue by evaluating X_m for the
 145 maximum, minimum, and average values of Y_p and Y_m over their ensemble of 16 condensate

146 tank flashing profiles, thus obtaining a range of estimates for X_m . In the present case,
 147 though, one finds that for all but one set of flashing profiles, the implied X_p (based on
 148 equation 13) is negative. Thus, in order to understand the full range of possible venting
 149 rates, we first need to determine the space of Y_m , Y_p , and Y_b for which X_m , X_p , and X_b
 150 are all non-negative. (We always assume, as in P12, that Y_m , Y_p , and Y_b are obtained by
 151 some linear combination of the 16 flashing profiles used in P12.) Specifically, we need to
 152 determine the sets of Y_m , Y_p , and Y_b that maximize and minimize implied X_m .

153 We find that X_m is maximized for $Y_m = 0.51$, $Y_p = 0.32$, and $Y_b = 0.17$. The similar
 154 values that minimize X_m depend on $a_{b/p}$. We find that for observations using the mobile
 155 lab ($a_{b/p} = 0.490$), X_m is minimized for $Y_m = 0.56$, $Y_p = 0.33$, and $Y_b = 0.16$, while for
 156 observations using the BAO ($a_{b/p} = 0.447$), X_m is minimized for $Y_m = 0.58$, $Y_p = 0.33$,
 157 and $Y_b = 0.16$ (detailed justifications for these figures are in the online supplementary
 158 materials).

159 Equation 15 now allows us to calculate the range of most likely values for X_m , and
 160 hence x_m . (We present no expected value within this range because we have no way
 161 of determining which values of Y_i are most likely.) We also estimate uncertainties (95
 162 percent confidence intervals) in the maximum and minimum values for these ranges by
 163 propagating known uncertainties in b , $a_{m/p}$, and $a_{b/p}$. Uncertainties in $a_{m/p}$ are given in
 164 Table 3 of P12. Table 3 of P12 also reports uncertainties for $a_{b/p}$, but these exclude sys-
 165 tematic uncertainty of as much as 20 percent (total) due to provisional calibration of the
 166 equipment used to measure n-butane concentrations (Gabrielle Petron, personal commu-
 167 nication); we combine both sources of uncertainty in our estimates. The uncertainty for
 168 b reported above ($b = 4.15 \pm_{1.65}^{2.43}$) is for a single well; the uncertainty for a sample with a

169 large number of wells will be lower unless we assume that all wells are of the same profile.
170 We estimate uncertainties both in the conservative case where all venting emissions come
171 from wells with one consistent profile, and for the more realistic (but still arguably some-
172 what conservative) case where 100 different profiles are represented among wells that vent
173 significantly. This is still somewhat conservative but it more likely to be more realistic,
174 and reduces uncertainty in b by a factor of 10. Since b is only weakly correlated with $a_{m/p}$
175 — their correlation coefficient is 0.24, or 0.19 if we exclude wells drilled in the Sussex
176 zone, which are rare — this is still much weaker than the implicit assumption made in
177 P12 that wells that vent significantly have random $a_{m/p}$. The results are summarized in
178 Table 2 and Figure 1.

179 With the exception of the combination of BAO observations and highly conservative
180 uncertainty estimates, all of the inferred methane emissions rates are consistent with
181 those derived from accepted bottom-up inventories, but inconsistent with the top-down
182 estimates reported in P12. Indeed the method used here places considerably tighter
183 constraints on methane emissions than previous ones have. The one exception is in the
184 case of observations at the BAO using highly conservative uncertainty estimates: there,
185 there remains a very small chance that annual methane venting emissions are greater
186 than 118 Gg/yr. It is most likely, though, that this simply indicates that observations at
187 a single point (the BAO) are insufficient to tightly constrain possible methane emissions
188 across the entire Denver-Julesburg basin.

5. Conclusion

189 P12 infer from air measurements of methane-to-propane ratios that methane leakage
190 from oil and gas operations in Weld County, Colorado, is considerably higher than pre-

191 viously believed. However, this inference is based on assumptions about the molecular
192 profile of vented natural gas that lack support. Using observed methane-to-propane and
193 butane-to-propane ratios, both of which are reported in P12, we have made independent
194 estimates of methane emissions that do not rely on assumptions about the composition of
195 vented gas. These estimates are largely consistent with previous bottom-up predictions
196 of methane emissions from oil and gas operations. The coincidence of bottom-up and
197 new top-down estimates reported here for estimates using the mobile lab, as well as the
198 modest uncertainties in methane leakage inferred from those observations, also indicates
199 the potential value of carefully monitoring alkane concentrations in air near oil and gas
200 operations, particularly through sampling across entire areas of operations. Additional
201 observations, including statistically meaningful samples of flashing emission profiles from
202 condensate tanks, could be used to further constrain estimates of methane emissions.
203 Moreover, the prominent role of uncertainty in $a_{b/p}$ in the analysis suggests that repeating
204 the observations reported in P12 but with more careful calibration of n-butane measure-
205 ments could further constrain estimates of alkane venting from oil and gas operations.

Appendix A: Online supplementary material to Comment on Hydrocarbon emissions characterization in the Colorado Front Range — A Pilot Study

206 Estimating methane emissions requires that we determine the sets of Y_m , Y_p , and Y_b
207 that maximize and minimize implied X_m .

208 Denote the constituent emissions for the sixteen flashing profiles used in P12 as Y_m^L ,
209 Y_p^L , and Y_b^L , where L is an index that ranges from 1 to 16, and Y_i^L is rate of emissions
210 of species i due to flashing that one would observe if all flashing emissions came from
211 condensate tanks with the profile of tank L . The values for Y_i^L are given in Table 3. We

212 have

$$213 \quad Y_i = \sum_L P_L Y_i^L \quad (\text{A1})$$

214 where P_L is the fraction of condensate tanks that generate flashing emissions with the
 215 same profile as that of tank L in the reference ensemble. To determine the set of P_L that
 216 maximizes implied X_m , note from equation 15 that X_m is linear in Y_m , Y_p , and Y_b . We
 217 thus have

$$218 \quad X_m = \sum_L P_L X_m^L \quad (\text{A2})$$

219 where X_m^L is X_m evaluated for $Y_i = Y_i^L$. Substituting the values of Y_i^L into A1 reveals
 220 that $X_m^{14} > X_m^L$ for all $L \neq 14$, which implies that X_m is maximized for $P_{14} = 1$ and
 221 $P_L = 0$ for $L \neq 14$. This corresponds to $Y_m = 0.51$, $Y_p = 0.32$, and $Y_b = 0.17$, all in
 222 Gmol/yr.

223 To determine the set of P_L that minimizes implied X_m , note from equation 13 that X_p
 224 is linear in Y_b and Y_p . We thus have

$$225 \quad X_p = \sum_L P_L X_p^L \quad (\text{A3})$$

226 where X_p^L is X_p evaluated for $Y_i = Y_i^L$. Substituting the values of Y_i^L into A3 reveals
 227 that $X_p^{14} > 0$ and $X_p^L < 0$ for all $L \neq 14$. In order to have $X_p > 0$, then, we must have
 228 $P_{14} > 0$. In addition, for any choice of Y_b and Y_p such that implied $X_p > 0$, we can lower
 229 the implied X_p and X_m by lowering P_{14} and increasing any of those P_L for which $X_m^L < 0$.
 230 This implies that X_m will be minimized for a set of P_L such that $X_p = 0$, or $Y_b = Y_p - a_{b/p}$.

231 We can rewrite equations A2 and A3 to get

$$232 \quad X_m = \sum_{L \neq 14} P_L (X_m^L - X_m^{14}) + X_m^{14} \quad (\text{A4})$$

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$$X_p = \sum_{L \neq 14} P_L (X_p^L - X_p^{14}) + X_p^{14} \quad (\text{A5})$$

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Define $R_L = (X_m^L - X_m^{14}) / (X_p^L - X_p^{14})$ for all $L \neq 14$. Note that R_L is maximized for $L = 8$. We now show that X_m is minimized only if $P_L = 0$ for all $L \notin \{8, 14\}$. To do that, assume that we have some set of P_L than minimizes X_m . For any $K \notin \{8, 14\}$, decreasing P_K by Δ while increasing P_8 by $\Delta(X_p^K - X_p^{14}) / (X_p^8 - X_p^{14})$ and P_{14} by $\Delta(X_p^8 - X_p^K) / (X_p^8 - X_p^{14})$, where Δ is an arbitrarily small positive number, leaves $X_p > 0$. It does, however, decrease X_m by $(X_p^{14} - X_p^K) / (R_8 - R_K)$. This implies that X_m could only have been a minimum if P_L was zero for all $L \notin \{8, 14\}$ in the first place.

We thus know that X_m is minimized for some P_L such that P_8 and P_{14} are nonzero and $P_L = 0$ for all other L . As noted above, this minimum will occur as X_p approaches zero. We can thus calculate P_8 and P_{14} that minimize X_m for each possible value of $a_{b/p}$. For observations made using the mobile lab ($a_{b/p} = 0.490$), this is obtained for $P_8 = 0.10, P_{14} = 0.90$ ($Y_m = 0.56, Y_p = 0.33, Y_b = 0.16$). For observations using the BAO ($a_{b/p} = 0.447$), this is obtained for $P_8 = 0.14$ and $P_{14} = 0.86$ ($Y_m = 0.58, Y_p = 0.43, Y_b = 0.16$).

References

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Figure 1. Estimated methane emissions from venting in Gg/yr. Top plot shows top-down estimates based on mobile lab observations; middle plot shows top-down estimates based on BAO observations; lower plot shows bottom-up estimates from P12. Shaded boxes show range of expected values (due to irreducible uncertainty in flashing emissions). Solid lines show 95 percent confidence intervals for expected values with realistic assumptions about variation of $\nu_{b/p}$ among venting-prone wells as described in the text; dashed lines show 95 percent confidence intervals under the more conservative assumption that all wells that vent have the same $\nu_{b/p}$.

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Table 1. Estimates of Methane Emissions From P12 in Gg/yr

| | Bottom Up Emissions | | | Top Down Venting Emissions | | |
|---------|---------------------|---------|--------------------|----------------------------|---------------------|---------------------|
| | Flashing | Venting | Flashing + Venting | $\nu_{m/p}=18.75$ | $\nu_{m/p} = 15.43$ | $\nu_{m/p} = 24.83$ |
| Average | 11.2 | 53.1 | 64.3 | 118.4 | 157 | 92.5 |
| Minimum | 4 | 42 | 46 | 86.5 | 114.7 | 67.6 |
| Maximum | 23 | 63 | 86 | 172.6 | 228.9 | 134.9 |

Table 2. Revised Estimates of Methane Emissions in Gg/yr

| | Mobile Lab | | | BAO | | |
|---------|------------|------------------|---------------------|----------|------------------|---------------------|
| | Expected | Realistic Errors | Conservative Errors | Expected | Realistic Errors | Conservative Errors |
| Maximum | 52.5 | +15.9/-10.9 | +19.5/-11.0 | 58.8 | +20.1/-12.8 | +62.2/-13.8 |
| Minimum | 46.4 | +4.4/-3.9 | +4.5/-3.9 | 49.4 | +2.9/-9.6 | +28.5/-9.9 |

Table 3. Flashing Profiles For Reference Tank Ensemble

| Tank # | Y_m | Y_p | Y_b |
|--------|-------|-------|-------|
| 1 | 1.537 | 0.424 | 0.107 |
| 2 | 0.369 | 0.498 | 0.173 |
| 3 | 0.551 | 0.476 | 0.168 |
| 4 | 0.787 | 0.383 | 0.135 |
| 5 | 0.235 | 0.446 | 0.145 |
| 6 | 0.611 | 0.411 | 0.079 |
| 7 | 0.501 | 0.398 | 0.147 |
| 8 | 1.034 | 0.355 | 0.095 |
| 9 | 1.357 | 0.393 | 0.120 |
| 10 | 0.810 | 0.378 | 0.109 |
| 11 | 0.271 | 0.396 | 0.146 |
| 12 | 0.749 | 0.38 | 0.125 |
| 13 | 1.122 | 0.396 | 0.125 |
| 14 | 0.507 | 0.322 | 0.167 |
| 15 | 0.352 | 0.463 | 0.171 |
| 16 | 0.427 | 0.544 | 0.168 |