

Adding a third normal to CLUBB

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Cloud **L**ayers **U**nified **B**y **B**inormals . . .

. . . is an atmospheric model that tried to predict the weather based on modeling a grid box with a sum of two normal distributions.

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Nature does not look like this, this is too binormal.

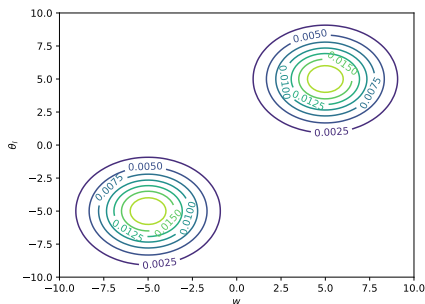


Figure: Binormal plot for two strong up-/downdrafts

$$w_1 = 5, w_2 = -5, \theta_{l1} = 5, \theta_{l2} = -5, \alpha = 0.5, \sigma_w = 2, \sigma_{\theta_{l1}} = 2, \sigma_{\theta_{l2}} = 2.$$

To reduce the bimodality we can increase the widths.

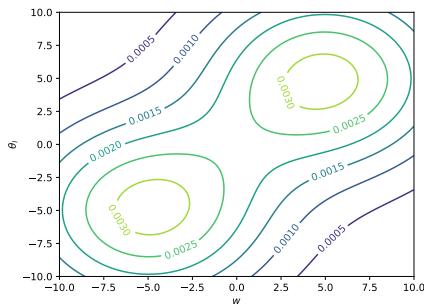


Figure: Binormal plot for two strong up-/downdrafts with increased standard deviations

$$w_1 = 5, w_2 = -5, \theta_{l1} = 5, \theta_{l2} = -5, \alpha = 0.5, \sigma_w = 5, \sigma_{\theta_{l1}} = 5, \sigma_{\theta_{l2}} = 5.$$

Adding a third normal is more realistic.

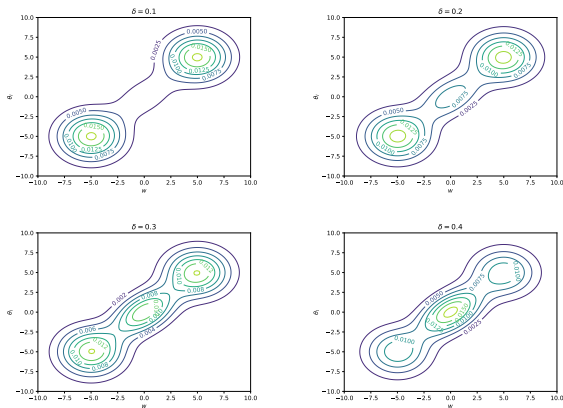


Figure: Trinormal plot for two strong up-/downdrafts with varying δ

$$w_1 = 5, w_2 = -5, \theta_{l1} = 5, \theta_{l2} = -5, \alpha = 0.5, \sigma_w = 2, \sigma_{\theta_{l1}} = 2, \sigma_{\theta_{l2}} = 2, \\ \sigma_{w3} = 2, \sigma_{3\theta_l} = 2, \rho_{w\theta_l} = 0.5.$$

A third normal even allows “weird” shapes.

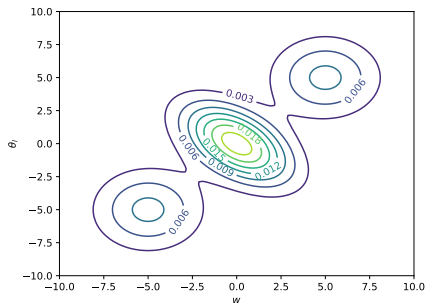


Figure: Trinormal plot for two strong up-/downdrafts with a third peak in the middle

$$w_1 = 5, w_2 = -5, \theta_{l1} = 5, \theta_{l2} = -5, \alpha = 0.5, \delta = 0.5, \sigma_w = 2, \sigma_{\theta_{l1}} = 2, \\ \sigma_{\theta_{l2}} = 2, \sigma_{w3} = 2, \sigma_{\theta_{l3}} = 2, \rho_{w\theta_l} = 0.5.$$

Consider the following prognostic pde [Lar22, p. 21]:

$$\frac{\partial \overline{w'\theta'_l}}{\partial t} = -\overline{w} \frac{\partial \overline{w'\theta'_l}}{\partial z} - \frac{1}{\rho_s} \frac{\partial \rho_s \overline{w'^2 \theta'_l}}{\partial z} - \overline{w'^2} \frac{\partial \overline{\theta'_l}}{\partial z} - \overline{w'\theta'_l} \frac{\partial \overline{w}}{\partial z} + \dots$$

We need to close the third order moment ($\overline{w'^2 \theta'_l}$) by integration over the pdf.

There already exist closures that assume a binormal pdf [LG05], e.g.

$$\overline{w'^2} = \alpha[(w_1 - \overline{w})^2 + \sigma_w^2] + (1 - \alpha)[(w_2 - \overline{w})^2 + \sigma_w^2]. \quad (2.1)$$

We can transform to a trinormal pdf using the following formulas:

$$\overline{w'^2} \frac{1 - \delta \lambda_w}{1 - \delta} = \overline{w'^2}_{dGn} \quad (2.2)$$

$$\overline{w'^3} \frac{1}{1 - \delta} = \overline{w'^3}_{dGn} \quad (2.3)$$

$$\frac{\overline{w'^3}}{\overline{w'^2}^{3/2}} \frac{(1 - \delta)^{1/2}}{(1 - \lambda_w \delta)^{3/2}} = \frac{\overline{w'^3}_{dGn}}{\overline{w'^2}_{dGn}^{3/2}} \quad (2.4)$$

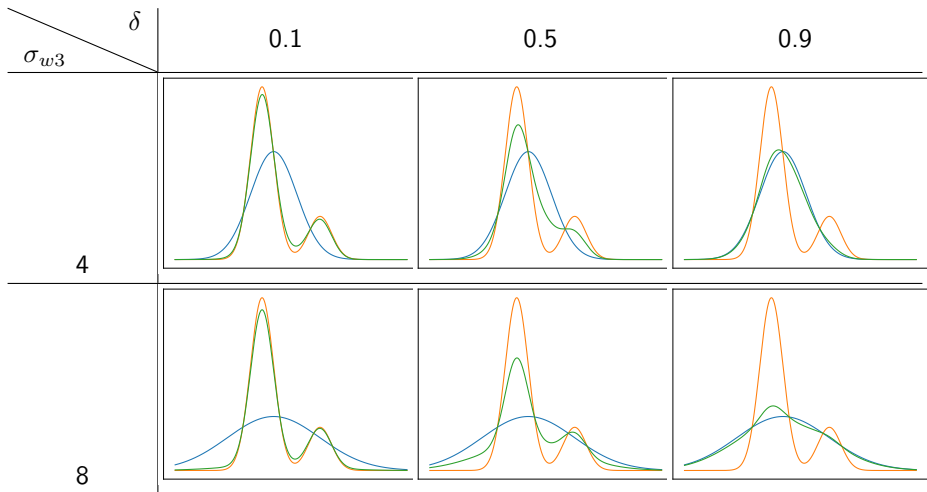
$$\overline{\theta'_l{}^2} \frac{1 - \delta \lambda_\theta}{1 - \delta} = \overline{\theta'_l{}^2}_{dGn} \quad (2.5)$$

$$\overline{w' \theta'_l} \frac{1 - \delta \lambda_{w\theta}}{1 - \delta} = \overline{w' \theta'_l}_{dGn} \quad (2.6)$$

If we substitute in a formula for λ_w (4.6), which will be explained later on, we get

$$\overline{w'^2} \left(1 - \delta \frac{\sigma_{w3}^2}{\overline{w'^2}} \right) = (1 - \delta) \overline{w'^2}_{dGn} \quad (2.7)$$

$$\Longleftrightarrow \overline{w'^2} = \overline{w'^2}_{dGn} - \delta \left(\overline{w'^2}_{dGn} - \sigma_{w3}^2 \right) \quad (2.8)$$

Table: 1D Plots for different δ and σ_{w3}

$w_1 = 5$, $w_2 = -5$, $\alpha = 0.2$, $\sigma_w = 2$. The blue plot represents the third normal, the orange/red one represents the binormal, and the green one represents the mixture. The x and y labels and ticks are omitted for clarity.

The goal of this thesis is to verify that all the transformations work out well.

Forward run (weather forecast)

- Given: \overline{w} , $\overline{w'^2}$, $\overline{w'^3}$, $\overline{\theta_l}$, $\overline{w'\theta'_l}$, $\overline{r_t}$, $\overline{w'r'_t}$, $\overline{\theta'^2_l}$, $\overline{r'^2_t}$, $\overline{r'_t\theta'_l}$.

Forward run (weather forecast)

- Given: \overline{w} , $\overline{w'^2}$, $\overline{w'^3}$, $\overline{\theta_l}$, $\overline{w'\theta'_l}$, $\overline{r_t}$, $\overline{w'r'_t}$, $\overline{\theta'^2_l}$, $\overline{r'^2_t}$, $\overline{r'_t\theta'_l}$.
- Find: Parameters, which describe the shape of the underlying pdf, for ultimately describing higher-order moments, e.g. $\overline{w'^2\theta'_l}$ in terms of lower-order moments.

Backward run (verification direction)

- Given: pdf parameters, e.g. mean, standard deviation

Backward run (verification direction)

- Given: pdf parameters, e.g. mean, standard deviation
- Find: lower- and higher-order moments

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Multivariate

We say that a random vector \mathbf{X} is distributed according to a multivariate normal distribution when it has the following joint density function [Ize08, p. 59]:

Definition (pdf of a multivariate normal distribution)

$$f(\mathbf{x}|\boldsymbol{\mu}, \boldsymbol{\Sigma}) = (2\pi)^{-\frac{r}{2}} |\boldsymbol{\Sigma}|^{-\frac{1}{2}} \exp\left(-\frac{1}{2}(\mathbf{x} - \boldsymbol{\mu})^\top \boldsymbol{\Sigma}^{-1}(\mathbf{x} - \boldsymbol{\mu})\right), \mathbf{x} \in \mathbb{R}^r, \quad (3.1)$$

where

$$\boldsymbol{\mu} = \begin{pmatrix} \mu_1 \\ \vdots \\ \mu_r \end{pmatrix} \in \mathbb{R}^r, \text{ and } \boldsymbol{\Sigma} = \begin{pmatrix} \sigma_1^2 & \rho_{12}\sigma_1\sigma_2 & \dots & \rho_{1r}\sigma_1\sigma_r \\ \rho_{12}\sigma_1\sigma_2 & \sigma_2^2 & \dots & \vdots \\ \vdots & \dots & \ddots & \vdots \\ \rho_{1r}\sigma_1\sigma_r & \dots & \dots & \sigma_r^2 \end{pmatrix} \in \mathbb{R}^{r \times r} \quad (3.2)$$

Moments

We denote the skewness and kurtosis by the following:

$$\mathbb{E}[X^3] = \mathbb{E} \left[\left(\frac{X - \mu}{\sigma} \right)^3 \right] = \frac{\mathbb{E}[(X - \mu)^3]}{(\mathbb{E}[(X - \mu)^2])^{3/2}} = \frac{\mu_3}{\sigma^3} \quad (3.3)$$

$$\mathbb{E}[X^4] = \mathbb{E} \left[\left(\frac{X - \mu}{\sigma} \right)^4 \right] = \frac{\mathbb{E}[(X - \mu)^4]}{(\mathbb{E}[(X - \mu)^2])^2} = \frac{\mu_4}{\sigma^4} \quad (3.4)$$

- w - upward wind (or up-/downdraft)
- r_t - total water mixing ratio
- θ_l - liquid water potential temperature

The variables mostly appear in centered form, e.g. $w' = w - \bar{w}$.
For example $\overline{w'^2}$ is the centered variance.

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Normal Mixture

$$\begin{aligned} P_{tmg}(w, \theta_l, r_t) = & \alpha(1 - \delta)\mathcal{N}(\mu_1, \Sigma_1) \\ & + (1 - \alpha)(1 - \delta)\mathcal{N}(\mu_2, \Sigma_2) \\ & + \delta\mathcal{N}(\mu_3, \Sigma_3), \end{aligned} \tag{4.1}$$

where \mathcal{N} denotes the multivariate normal distribution, $\alpha \in (0, 1)$ is the mixture fraction of the binormal, and $\delta \in [0, 1)$ is the weight of the third normal.

Mean of first and second component

$$\mu_1 = \begin{pmatrix} w_1 \\ \theta_{l1} \\ r_{t1} \end{pmatrix}, \mu_2 = \begin{pmatrix} w_2 \\ \theta_{l2} \\ r_{t2} \end{pmatrix} \quad (4.2)$$

Covariance between first and second component

$$\Sigma_1 = \begin{pmatrix} \sigma_w^2 & 0 & 0 \\ 0 & \sigma_{\theta_{l1}}^2 & \rho_{\theta_l r_t} \sigma_{\theta_{l3}} \sigma_{r_t 3} \\ 0 & \rho_{\theta_l r_t} \sigma_{\theta_{l3}} \sigma_{r_t 3} & \sigma_{r_{t1}}^2 \end{pmatrix} \quad (4.3)$$

$$\Sigma_2 = \begin{pmatrix} \sigma_w^2 & 0 & 0 \\ 0 & \sigma_{\theta_{l2}}^2 & \rho_{\theta_l r_t} \sigma_{\theta_{l3}} \sigma_{r_t 3} \\ 0 & \rho_{\theta_l r_t} \sigma_{\theta_{l3}} \sigma_{r_t 3} & \sigma_{r_{t2}}^2 \end{pmatrix} \quad (4.4)$$

Placing of the third component

We place the third normal component at the mean in order to simplify the math.

$$\mu_3 = \begin{pmatrix} \overline{w} \\ \overline{\theta_l} \\ \overline{r_t} \end{pmatrix}, \text{ and } \Sigma_3 = \begin{pmatrix} \sigma_{w3}^2 & \rho_{w\theta_l3}\sigma_{w3}\sigma_{\theta_l3} & \rho_{wr_t3}\sigma_{w3}\sigma_{r_t3} \\ \rho_{w\theta_l3}\sigma_{w3}\sigma_{\theta_l3} & \sigma_{\theta_l3}^2 & \rho_{\theta_lr_t3}\sigma_{\theta_l3}\sigma_{r_t3} \\ \rho_{wr_t3}\sigma_{w3}\sigma_{r_t3} & \rho_{\theta_lr_t3}\sigma_{\theta_l3}\sigma_{r_t3} & \sigma_{r_t3}^2 \end{pmatrix} \quad (4.5)$$

Additional definitions

$$\lambda_w \equiv \frac{\sigma_{w3}^2}{w'^2}, \quad \lambda_\theta \equiv \frac{\sigma_{\theta_l 3}^2}{\theta_l'^2}, \quad \lambda_r \equiv \frac{\sigma_{r_t 3}^2}{r_t'^2}, \quad (4.6)$$

$$\lambda_{\theta r} \equiv \frac{\rho_{\theta_l r_t} \sigma_{\theta_l 3} \sigma_{r_t 3}}{r_t' \theta_l'}, \quad \lambda_{w\theta} \equiv \frac{\rho_{w\theta_l} \sigma_{w3} \sigma_{\theta_l 3}}{w' \theta_l'}, \quad \lambda_{wr} \equiv \frac{\rho_{wr_t} \sigma_{w3} \sigma_{r_t 3}}{w' r_t'} \quad (4.7)$$

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$$\begin{aligned}
\overline{w'^4} &= \left(\overline{w'^2}\right)^2 \frac{(1 - \delta\lambda_w)^2}{(1 - \delta)} \left(3\tilde{\sigma}_w^4 + 6(1 - \tilde{\sigma}_w^2) \tilde{\sigma}_w^2 + (1 - \tilde{\sigma}_w^2)^2\right) \\
&+ \frac{1}{(1 - \tilde{\sigma}_w^2)} \frac{1}{(1 - \delta\lambda_w)} \frac{\left(\overline{w'^3}\right)^2}{\overline{w'^2}} \\
&+ \delta 3\lambda_w^2 \left(\overline{w'^2}\right)^2
\end{aligned} \tag{5.1}$$

$$\overline{w'^2 \theta'_l} = \frac{1}{(1 - \tilde{\sigma}_w^2)} \frac{1 - \delta \lambda_{w\theta}}{1 - \delta \lambda_w} \frac{\overline{w'^3}}{\overline{w'^2}} \overline{w' \theta'_l} \quad (5.2)$$

$$\begin{aligned}
 \overline{w' \theta_l'^2} &= \frac{2}{3} \frac{(1 - \delta \lambda_{w\theta})^2}{(1 - \delta \lambda_w)^2} \frac{1}{(1 - \tilde{\sigma}_w^2)^2} \frac{\overline{w'^3}}{(\overline{w'^2})^2} \left(\overline{w' \theta_l'} \right)^2 \\
 &+ \frac{1}{3} \frac{(1 - \delta \lambda_w)}{(1 - \delta \lambda_{w\theta})} (1 - \tilde{\sigma}_w^2) \frac{\overline{w'^2} \overline{\theta_l'^3}}{\overline{w' \theta_l'}}
 \end{aligned} \tag{5.3}$$

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Limit for $\overline{w'^4}$ as δ goes to 1

As skewness goes to zero we want the pdf to revert to a single normal ($\delta \rightarrow 1$).

$$\lim_{\delta \rightarrow 1} \left(\overline{w'^4} \right) = \left(\frac{\left(\overline{w'^3} \right)^2}{(1 - \delta \lambda_w) \left(\overline{w'^2} - \frac{\sigma_w^2}{2 - c_1} \right)} \right) + 3 \left(\overline{w'^2} \right)^2 \quad (6.1)$$

Limit for $\overline{w'^2\theta'_l}$ as δ goes to 1

$$\lim_{\delta \rightarrow 1} \left(\overline{w'^2\theta'_l} \right) = \frac{(c_1 - 2)^2 \overline{w'\theta'_l} \cdot \overline{w'^3}}{(c_2 - 2) \left((c_1 - 2) \overline{w'^2} + \sigma_w^2 \right)} \quad (6.2)$$

Limit for $\overline{w'^2 \theta'_l}$ as δ goes to 1

As skewness goes to zero we want the pdf to revert to a single normal ($\delta \rightarrow 1$).

$$\lim_{\delta \rightarrow 1} \left(\overline{w'^2 \theta'_l} \right) = \lim_{\delta \rightarrow 1} \left(\frac{2}{3} \frac{(1 - \delta \lambda_{w\theta})^2}{(1 - \delta \lambda_w)^2} \frac{1}{(1 - \tilde{\sigma}_w^2)^2} \frac{\overline{w'^3}}{(\overline{w'^2})^2} \left(\overline{w' \theta'_l} \right)^2 \right. \\ \left. + \frac{1}{3} \frac{(1 - \delta \lambda_w)}{(1 - \delta \lambda_{w\theta})} (1 - \tilde{\sigma}_w^2) \frac{\overline{w'^2} \overline{\theta'_l{}^3}}{\overline{w' \theta'_l}} \right) \quad (6.3)$$

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We have checked the higher-order moment formulas using SymPy.

DEMONSTRATION
(Analytic integration using SymPy [Meu+17])

Code to follow along the demonstration I

Listing: Import statements

```
import sympy as sp
from IPython.display import display
from sympy import abc, oo, Symbol, Integral
from sympy.stats import Normal, density
```

Listing: Defining symbols

```
sigma_w = Symbol('\sigma_w')
w_1 = Symbol('w_1')
w_2 = Symbol('w_2')
w_bar = Symbol('\overline{w}')
sigma_w_3 = Symbol('\sigma_{w3}')
w_prime_2_bar = Symbol('\overline{w}^{'2'})
```


Code to follow along the demonstration II

Listing: Defining the marginals

```
G_1_w = Normal(name='G_1_w', mean=w_1, std=sigma_w)
G_1_w_density = density(G_1_w)(sp.abc.w)
G_2_w = Normal(name='G_2_w', mean=w_2, std=sigma_w)
G_2_w_density = density(G_2_w)(sp.abc.w)
G_3_w = Normal(name='G_3_w', mean=w_bar, std=sigma_w_3)
G_3_w_density = density(G_3_w)(sp.abc.w)
G_w = ((1 - sp.abc.delta) * sp.abc.alpha * G_1_w_density +
        (1 - sp.abc.delta) * (1 - sp.abc.alpha) * G_2_w_density +
        sp.abc.delta * G_3_w_density)
```

Listing: Defining and displaying the needed integral

```
w_prime_2_bar_int = sp.Integral((sp.abc.w - w_bar) ** 2 * G_w, [sp.abc.w, -oo,
↪ oo])
display(sp.Eq(w_prime_2_bar, w_prime_2_bar_int))
```

Code to follow along the demonstration III

Listing: Calculating and printing the integral

```
w_prime_2_bar_int_val = w_prime_2_bar_int.doit(conds='none').simplify()
display(sp.Eq(w_prime_2_bar, w_prime_2_bar_int_val))
```

Listing: Python function for the second order moment

```
def w_prime_2_bar_check(delta=sp.abc.delta, alpha=sp.abc.alpha, w_1=w_1,
↪ w_2=w_2, w_bar=w_bar, sigma_w=sigma_w, sigma_w_3=sigma_w_3):
return (((1 - delta) * alpha * ((w_1 - w_bar) ** 2 + sigma_w ** 2))
        + ((1 - delta) * (1 - alpha) * ((w_2 - w_bar) ** 2 + sigma_w ** 2))
        + (delta * sigma_w_3 ** 2))
```

Listing: Printing the symbolic equation

```
display(sp.Eq(w_prime_2_bar, w_prime_2_bar_check()))
```

Code to follow along the demonstration IV

Listing: Check if the integral and the given formula are the same

```
display(sp.factor(sp.Eq(w_prime_2_bar_int_val, w_prime_2_bar_check()),  
↪ sp.abc.alpha, sp.abc.delta))
```

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Univariate

We say that a random variable X is distributed according to a normal distribution ($X \sim \mathcal{N}(\mu, \sigma^2)$) when it has the following pdf:

Definition (pdf of a normal distribution)

$$f(x|\mu, \sigma^2) = \frac{1}{\sqrt{2\pi\sigma^2}} \exp\left(-\frac{1}{2} \left(\frac{x - \mu}{\sigma}\right)^2\right) \quad (9.1)$$