

# 微分方程式によるパラメトリック推定

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図, 資料など.

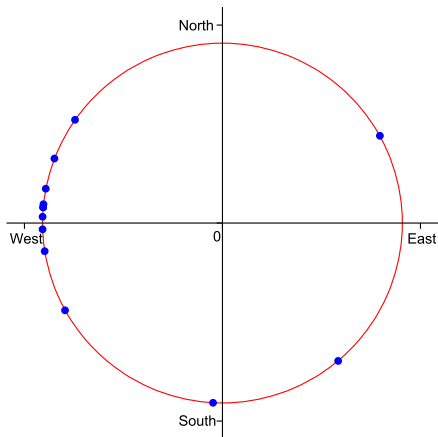


Figure: 札幌上空約 1 万メートル地点における午前 9 時の風向きの 13 日間のデータ (2011 年 1 月 1 日から 14 日 (11 日は欠損): 気象庁の気象統計情報から)

$(\cos t, \sin t)$  達を上記の 13 件のデータとする. HGD により

```
A=test1(); isFit(A);
```

$$\theta = (\theta_1, \theta_2) = (-0.1286, -1.5963).$$

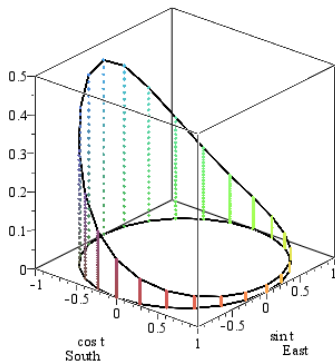


Figure: 推定したパラメータによる風向分布

$$F(x, y, r) = \int_{S^n(r)} \exp(t^T xt + yt) |dt| \quad (1)$$

$|dt|$  は球面上の Haar 測度.  $x$  は対称行列.  $y$  はベクトル.

## Theorem

Fisher-Bingham 積分  $F(x, y, r)$  は  $x, y, r$  の holonomic 関数.

## Theorem

付随する holonomic 系の holonomic rank (number of the standard monomials) は  $2n + 2$ .

初期値計算を除く HGD が要する計算量は

$O((2n+2)^3) \times$  (steps of the convergence of the gradient descent)

$n = 2.$

$$\partial_{x_{11}} - \partial_{y_1}^2, \partial_{x_{12}} - \partial_{y_1} \partial_{y_2}, \partial_{x_{13}} - \partial_{y_1} \partial_{y_3},$$

$$\partial_{x_{22}} - \partial_{y_2}^2, \partial_{x_{23}} - \partial_{y_2} \partial_{y_3}, \partial_{x_{33}} - \partial_{y_3}^2,$$

$$\partial_{x_{11}} + \partial_{x_{22}} + \partial_{x_{33}} - r^2,$$

$$x_{12} \partial_{x_{11}} + 2(x_{22} - x_{11}) \partial_{x_{12}} - x_{12} \partial_{x_{22}} + x_{23} \partial_{x_{13}} - x_{13} \partial_{x_{23}} + y_2 \partial_{y_1} - y_1 \partial_{y_2},$$

$$x_{13} \partial_{x_{11}} + 2(x_{33} - x_{11}) \partial_{x_{13}} - x_{13} \partial_{x_{33}} + x_{23} \partial_{x_{12}} - x_{12} \partial_{x_{23}} + y_3 \partial_{y_1} - y_1 \partial_{y_3},$$

$$x_{23} \partial_{x_{22}} + 2(x_{33} - x_{22}) \partial_{x_{23}} - x_{23} \partial_{x_{33}} + x_{13} \partial_{x_{12}} - x_{12} \partial_{x_{13}} + y_3 \partial_{y_2} - y_2 \partial_{y_3},$$

$$r \partial_r - 2(x_{11} \partial_{x_{11}} + x_{12} \partial_{x_{12}} + x_{13} \partial_{x_{13}} + x_{22} \partial_{x_{22}} + x_{23} \partial_{x_{23}} + x_{33} \partial_{x_{33}}) \\ - (y_1 \partial_{y_1} + y_2 \partial_{y_2} + y_3 \partial_{y_3}) - 2.$$

The astronomical data consist of the locations of 188 stars of magnitude brighter than or equal to 3.0.

Minimize

$$F(x, y, 1) \exp \left( - \sum_{1 \leq i < j \leq 3} S_{ij} x_{ij} - \sum_i S_i y_i \right)$$

on

$$(x_{11}, x_{12}, x_{13}, x_{22}, x_{23}, x_{33}, y_1, y_2, y_3)$$

$$\in [-30, 10] \times [-30, 10] \times [-30, 10] \times [-30, 10] \times [-30, 20] \times [-30, -0.01] \times [-30, -0.001] \times [-30, 10]$$

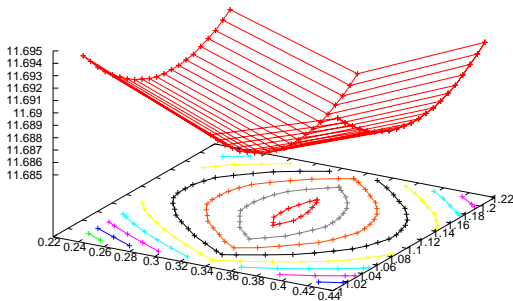
where  $(S_{11}, S_{12}, S_{13}, S_{22}, S_{23}, S_{33}, S_1, S_2, S_3) =$

$(0.3119, 0.0292, 0.0707, 0.3605, 0.0462, 0.3276, -0.0063, -0.0054, -0.076)$

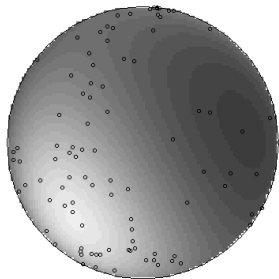
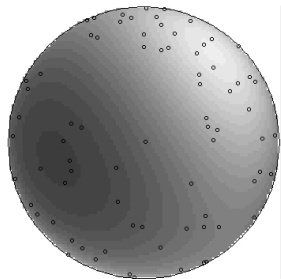
The result is that the minimum 11.68573121328159669 is taken at

$$x = \begin{pmatrix} -0.161 & 0.3377/2 & 1.1104/2 \\ 0.3377/2 & 0.2538 & 0.6424/2 \\ 1.1104/2 & 0.6424/2 & -0.0928 \end{pmatrix},$$

$$y = (\underline{-0.019}, \underline{-0.0162}, -0.2286)$$



# Estimated distribution





# 本格的な勉強のためのガイド

積分アルゴリズム, Pfaffian の導出, gradient の計算.

- ① 高山信毅,  $D$  加群の積分アルゴリズムと推定理論, 数学セミナー 2012.02, 41–46.
- ② D.Cox, J.Little, D.O'Shea, Ideals, Varieties and Algorithms, Springer, 1992. 日本語訳あり. [グレブナー基底の基礎](#) 1,2 章.
- ③ JST CREST 日比チーム (編), グレブナー道場. 共立出版. 第 1 章. Dojo multimedia. [グレブナー基底の基礎](#)
- ④ 道場, 第 6 章. [微分作用素環のグレブナー基底](#). 6.1–6.5.
- ⑤ 大阿久俊則.  $D$  加群と計算数学, 朝倉書店. 道場 6.6–6.10. [積分アルゴリズム](#)
- ⑥ 道場, 6.5 [HGD](#)

# Fisher-Bingham 分布の研究

- ① Hiromasa Nakayama, Kenta Nishiyama, Masayuki Noro, Katsuyoshi Ohara, Tomonari Sei, Nobuki Takayama, Akimichi Takemura, Holonomic Gradient Descent and its Application to the Fisher-Bingham Integral, arxiv:1005.5273, Advances in Applied Mathematics 47 (2011), 639–658 [HGD の方法論の提案も](#)
- ② T. Koyama, A Holonomic Ideal Annihilating the Fisher-Bingham Integral, <http://arxiv.org/abs/1104.1411>
- ③ T. Koyama, H. Nakayama, K. Nishiyama, N. Takayama, Holonomic Gradient Descent for the Fisher-Bingham Distribution on the  $n$ -dimensional Sphere, <http://arxiv.org/abs/1201.3239>
- ④ T. Koyama, H. Nakayama, K. Nishiyama, N. Takayama, The Holonomic Rank of the Fisher-Bingham System of Differential Equations, <http://arxiv.org/abs/??>

高次元 で HGD でないもの.

- ① K. Kume, A. T. A. Wood, Saddlepoint Approximations for the Bingham and Fisher-Bingham Normalising Constants, Biometrika **92** (2005), 465–476.

# Fisher 分布 (HGD), Wishart 分布 (HGM)

- ① Tomonari Sei, Hiroki Shibata, Akimichi Takemura, Katsuyoshi Ohara, Nobuki Takayama, Properties and applications of Fisher distribution on the rotation group, <http://arxiv.org/abs/1110.0721>
- ② Hiroki Hashiguchi, Yasuhide Numata, Nobuki Takayama, Akimichi Takemura, Holonomic gradient method for the distribution function of the largest root of a Wishart matrix, <http://arxiv.org/abs/1201.0472>

HGD でないもの.

- ① R.Butler, W.Ronald, A.T.A.Wood, Laplace approximations for hypergeometric functions with matrix argument, The Annals of Statistics (2002), 1155–1177.
- ② Wishart 分布については, 基本問題のため, その他多数あり. 上記論文の Reference を参照.