

# Tensors: From Data to Statistics

## First Session with Bernd Sturmfels at Ibadan

Every participant is asked to answer the following three binary questions:

*Are you from Ibadan or from elsewhere? Are you male or female? Do you wear glasses or not?*

The responses will be summarized in a table of format  $2 \times 2 \times 2$ , to be called the *Ibadan tensor*:

$$u = \left( \begin{pmatrix} u_{000} & u_{001} \\ u_{010} & u_{011} \end{pmatrix}, \begin{pmatrix} u_{100} & u_{101} \\ u_{110} & u_{111} \end{pmatrix} \right)$$

**Question 1:** A tensor  $p$  is called *independent* (or *rank one*) if its entries can be written in the form  $p_{ijk} = a_i b_j c_k$ . Show that the independent  $2 \times 2 \times 2$ -tensors form an irreducible algebraic variety  $\mathcal{I}$ .

**Question 2:** Compute a minimal generating set for the prime ideal of the variety  $\mathcal{I}$ .

**Question 3:** Evaluate each ideal generator at the Ibadan tensor  $u$ , and record the sign (positive, zero, or negative). What does this sign mean in statistics? (Hint: conditional independence)

**Question 4:** Fix a term order that refines the weights given by the Ibadan tensor  $u$ . Compute the reduced Gröbner bases for this ideal, and find all minimal primes of the initial monomial ideal.

**Question 5:** How many triangulations does the 3-dimensional cube have? Is this related to  $\mathcal{I}$ ?

**Question 6:** Find a tensor in  $\mathcal{I}$  that minimizes the Euclidean distance to the Ibadan tensor  $u$ . Is that tensor unique? Does it have nonnegative entries? If not, find a closest nonnegative tensor.

**Question 7:** Find a nonnegative tensor in  $\mathcal{I}$  that minimizes the likelihood function  $\prod p_{ijk}^{u_{ijk}}$ .

**Question 8:** Compare your answers for #6 and #7. Find and interpret  $(a_0, a_1), (b_0, b_1), (c_0, c_1)$ .

**Question 9:** Design a hypothesis test for independence and apply it to the Ibadan tensor  $u$ .