



# Validating Software for Probabilistic Genotyping

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**Points of view in this presentation are mine** and do not necessarily represent the official position or policies of the National Institute of Standards and Technology or the U.S. Department of Justice.

# Validating Software for Probabilistic Genotyping

- Tests where  $H_p$  is true:

Does the model correctly include  
a known contributor?

- Tests where  $H_d$  is true:

Does the model correctly exclude  
a known non-contributor?



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Forensic population genetics – original research

### Testing likelihood ratios produced from complex DNA profiles



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#### ABSTRACT

The performance of any model used to analyse DNA profile evidence should be tested using simulation, large scale validation studies based on ground-truth cases, or alignment with trends predicted by theory. We investigate a number of diagnostics to assess the performance of the model using  $H_d$  true tests. Of particular focus in this work is the proportion of comparisons to non-contributors that yield a likelihood ratio (LR) higher than or equal to the likelihood ratio of a known contributor ( $LR_{PO1}$ ), designated as  $p$ , and the average LR for  $H_d$  true tests. Theory predicts that  $p$  should always be less than or equal to  $1/LR_{PO1}$  and hence the observation of this in any particular case is of limited use. A better diagnostic is the average LR for  $H_d$  true which should be near to 1. We test the performance of a continuous interpretation model on nine DNA profiles of varying quality and complexity and verify the theoretical expectations.

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#### 1. Introduction

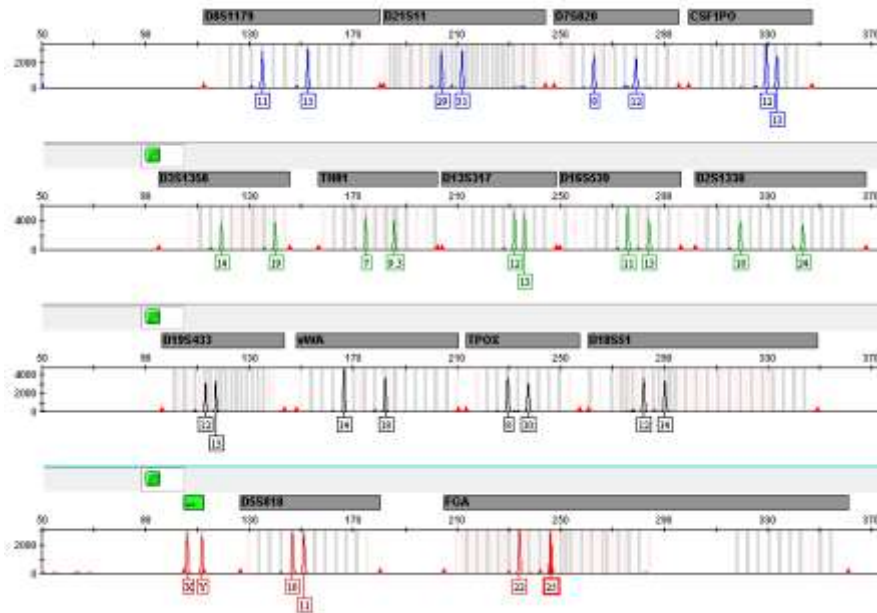
Methods for evaluating DNA profiles have benefitted from

frequentist methods and will call this fraction  $p$  but not interpret it, as a  $p$ -value, which would be more familiar if we were testing some hypothesis. This value of  $p$  is relative to a simulation and a model

# Three Main Points

- 1) The average value of the likelihood ratios ( $LRs$ ) obtained for tests where  $H_d$  is true is 1.
- 2) Information on the chance of adventitious matching is provided by the  $LR$ .
- 3) This theory provides a framework for assessing the performance of interpretation models.

# Scenario



person of  
interest (POI)

crime stain

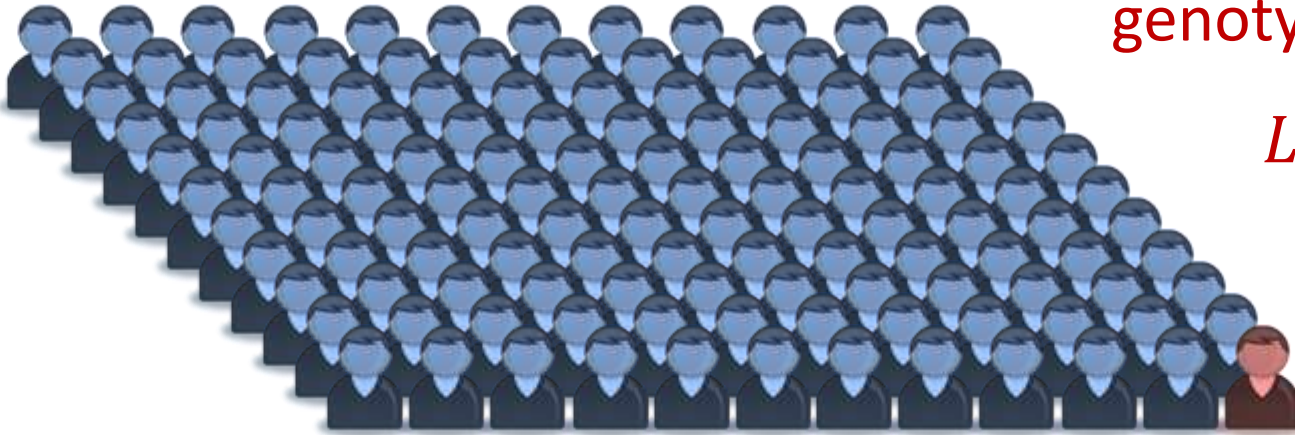
$H_p$ : The POI is the donor.

$H_d$ : An unknown person is the donor.

likelihood ratio  $LR = \frac{1}{1 \text{ billion}} = 1 \text{ billion}$

# Our Expectations if $H_d$ is true

1 billion randomly chosen individuals



1 randomly chosen individual has the same genotype as the POI:

$$LR = 1 \text{ billion}$$



999,999,999 randomly chosen individuals have a different genotype than the POI:

$$LR = 0$$

# Our Expectations if $H_d$ is true

Average value of the  $LR$ s:

$$\underbrace{\frac{999,999,999}{1 \text{ billion}} \times 0}_{\substack{999,999,999 \text{ individuals:} \\ LR = 0}} + \underbrace{\frac{1}{1 \text{ billion}} \times 1 \text{ billion}}_{\substack{1 \text{ individual:} \\ LR = 1 \text{ billion}}} = 1$$



1) The average value of the likelihood ratios ( $LRs$ ) obtained for tests where  $H_d$  is true is 1.

$$\begin{aligned} & \sum_i Pr(E_i|H_d) \times LR_i \\ &= \sum_i Pr(E_i|H_d) \frac{Pr(E_i|H_p)}{Pr(E_i|H_d)} \\ &= \sum_i Pr(E_i|H_p) \\ &= Pr(E_1 \cup E_2 \cup \dots \cup E_n|H_p) \\ &= 1 \end{aligned}$$

*the expected factor for a wrong hypothesis in virtue of any experiment is 1*



Alan Turing

# Three Main Points

- 1) The average value of the likelihood ratios ( $LR$ s) obtained for tests where  $H_d$  is true is 1.
- 2) Information on the chance of adventitious matching is provided by the  $LR$ .
- 3) This theory provides a framework for assessing the performance of interpretation models.

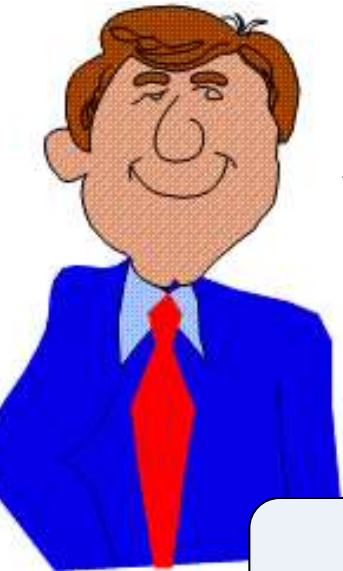
In court

What were the results of the comparison of the crime stain's DNA with the POI's DNA?

The DNA typing results of the crime stain are 1 *billion* times more probable to have been obtained if the POI is the donor of this DNA than if an unknown person is the donor of this DNA.

How many other people would adventitiously match this profile?

?



$LR_{POI} = 1 \text{ billion}$

$$LR_1 \leq LR_2 \leq LR_3 \leq \dots \leq LR_N$$

average of  $LRs$  smaller than  $LR_{POI}$

1 2 3

$$= \delta$$

average of  $LRs$  greater than or equal to  $LR_{POI}$

N

$$= 1 - \delta$$

$LR_{POI} = 1 \text{ billion}$

$LR_1 \leq LR_2 \leq LR_3 \leq \dots \leq LR_N$



$k$  individuals:

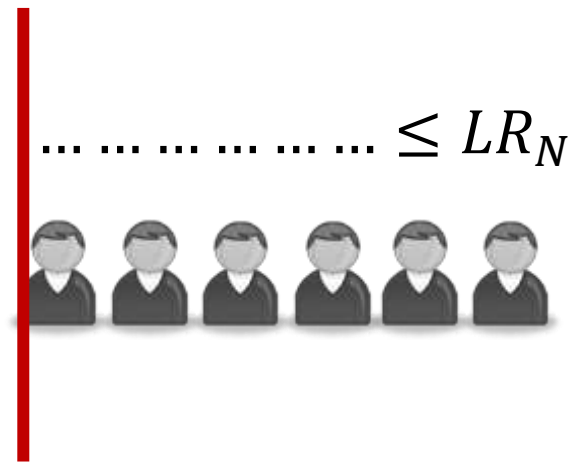
$LR_i \geq LR_{POI}$

Average of  $k$   $LR$ s:

$$\frac{k}{N} LR_{POI} + \varepsilon$$

$$= 1 - \delta$$

$LR_{POI} = 1 \text{ billion}$



2) Information on the chance of adventitious matching is provided by the  $LR$ .

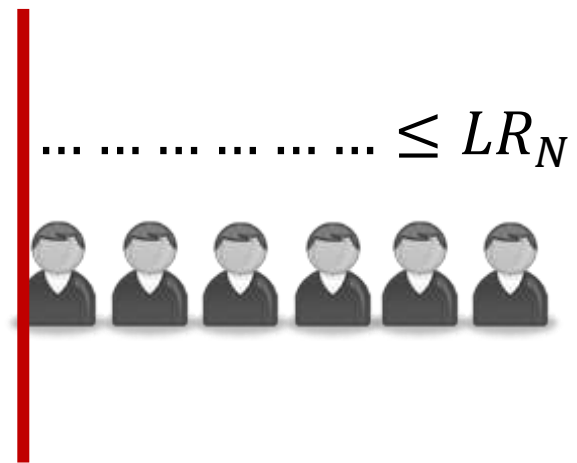
Average of  $k$   $LR$ s:

$$\frac{k}{N} LR_{POI} + \varepsilon = 1 - \delta$$

$$\frac{k}{N} = \frac{1 - \delta - \varepsilon}{LR_{POI}}$$

$$\frac{k}{N} \leq \frac{1}{LR_{POI}}$$

$LR_{POI} = 1 \text{ billion}$



The proportion of randomly chosen non-donors expected to yield a likelihood ratio of  $LR_{POI}$  or larger is less than or equal to 1 in  $LR_{POI}^{1.5}$

In court



What were the results of the comparison of the crime stain's DNA with the POI's DNA?

The DNA typing results of the crime stain are *1 billion* times more probable to have been obtained if the POI is the donor of this DNA than if an unknown person is the donor of this DNA.

How many other people would adventitiously match this profile?

The proportion of randomly chosen non-donors expected to yield a likelihood ratio of *1 billion* or larger is less than or equal to *1 in 1 billion*.





# Three Main Points

- 1) The average value of the likelihood ratios ( $LR$ s) obtained for tests where  $H_d$  is true is 1.
- 2) Information on the chance of adventitious matching is provided by the  $LR$ .
- 3) This theory provides a framework for assessing the performance of interpretation models.

This theory also applies  
to mixtures.

- 3) This theory provides a framework for assessing the performance of interpretation models.

The model's performance can be evaluated using  $H_d$  *true* tests.

1. Simulate random genotypes (these are the randomly chosen non-contributors)
2. Compare with the mixed DNA profile
3. Generate a  $LR$  for each with propositions

$H_p$ : The DNA came from *Random Person* and unknowns.

$H_d$ : The DNA came from unknowns.

3) This theory provides a framework for assessing the performance of interpretation models.

The model's performance can be evaluated using  $H_d$  true tests.

→ Calculate average *LR*

→ Calculate the proportion of *LRs* greater than or equal to the known contributors' *LRs*

# Conclusions

- Tests where  $H_p$  is true
- Tests where  $H_d$  is true:

Is the average  $LR$  close to 1?

Is the proportion of  $LR$ s greater than or equal to the known contributor's  $LR$  smaller than or equal to 1 over this  $LR$ ?

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Thank you for your attention