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# antibioticR

## An R package to identify resistant populations in environmental bacteria



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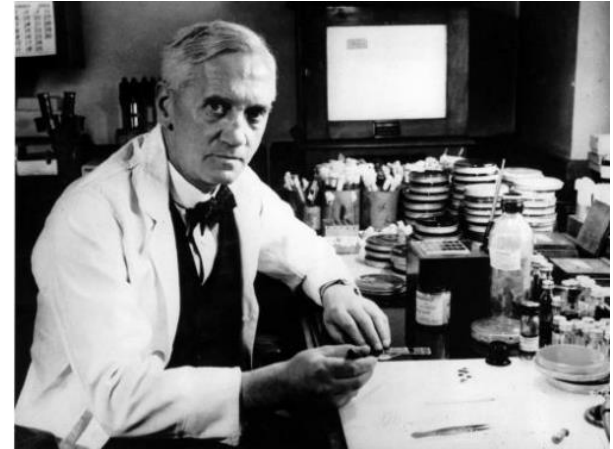
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<sup>3</sup> University Adelaide, Australia

# Antibiotics made modern medicine possible

## Sir Alexander Fleming (1881 –1955)

- knighted by British king in 1944
- Nobel prize in medicine 1945
- (re-)discovered penicillin in 1928 "by accident"
- isolation of penicillin
  - made modern medicine possible
  
- discovered already, that resistance develops if penicillin application is too low or too short



Calibuon at English Wikibooks [Public domain]  
[https://commons.wikimedia.org/wiki/File:Alexander\\_Fleming.jpg](https://commons.wikimedia.org/wiki/File:Alexander_Fleming.jpg)



#Documentary #Antibiotikakrise #ResistanceFighters

RESISTANCE FIGHTERS - The Global Antibiotics Crisis | Trailer (English, 1'30", HD)

„Drug resistant bacteria kill 700.000 citizens each year.“  
„This figure is rising dramatically.“  
„Resistant microbes will prevail the near future.“

<https://www.broadview.tv/en/production/resistance-fighters-the-global-antibiotics-crisis/>

# Our contribution

## Clinical context

- Susceptibility of microbial species
- Selection of suitable antibiotics
- Effective dosing

Large international organizations, e.g. US-FDA, CLSI, EUCAST

Careful characterisation of resistance with Excel-Tools and expert judgment

## Environmental context

- Sources of resistance
- Influence of environmental factors
- Effectivity of reduction measures
- Evolution and transmission of genes

Aquatic and Environmental Sciences

→ need automatic and reproducible tools for screening and systems understanding.

# Inhibition Zone Diameter (ZD) Similar to the method of Fleming

- (3) susceptibility tests
- single strain
  - multiple antibiotics

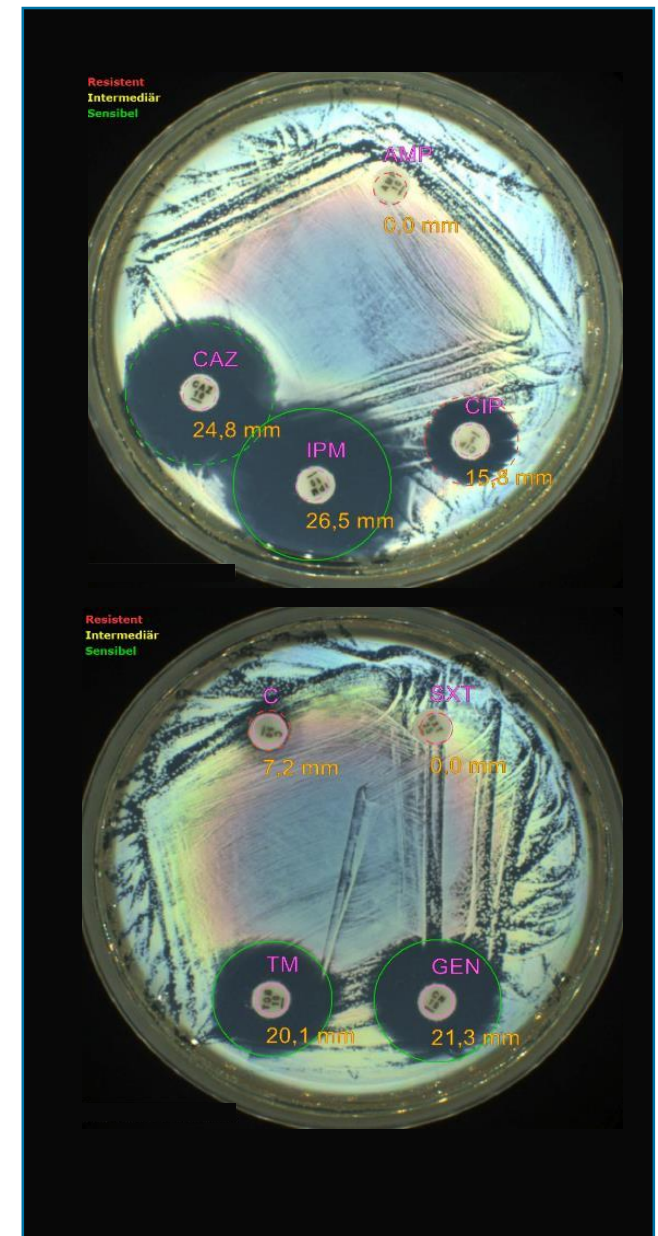
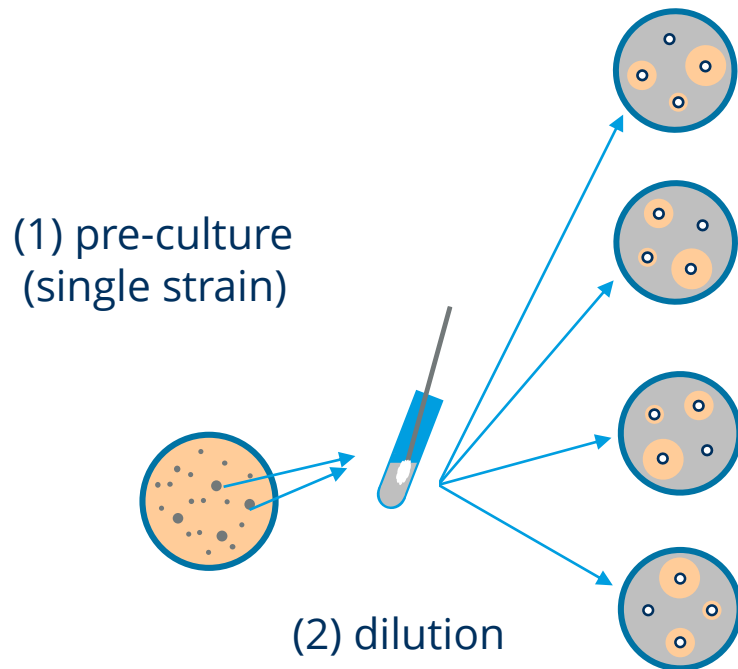
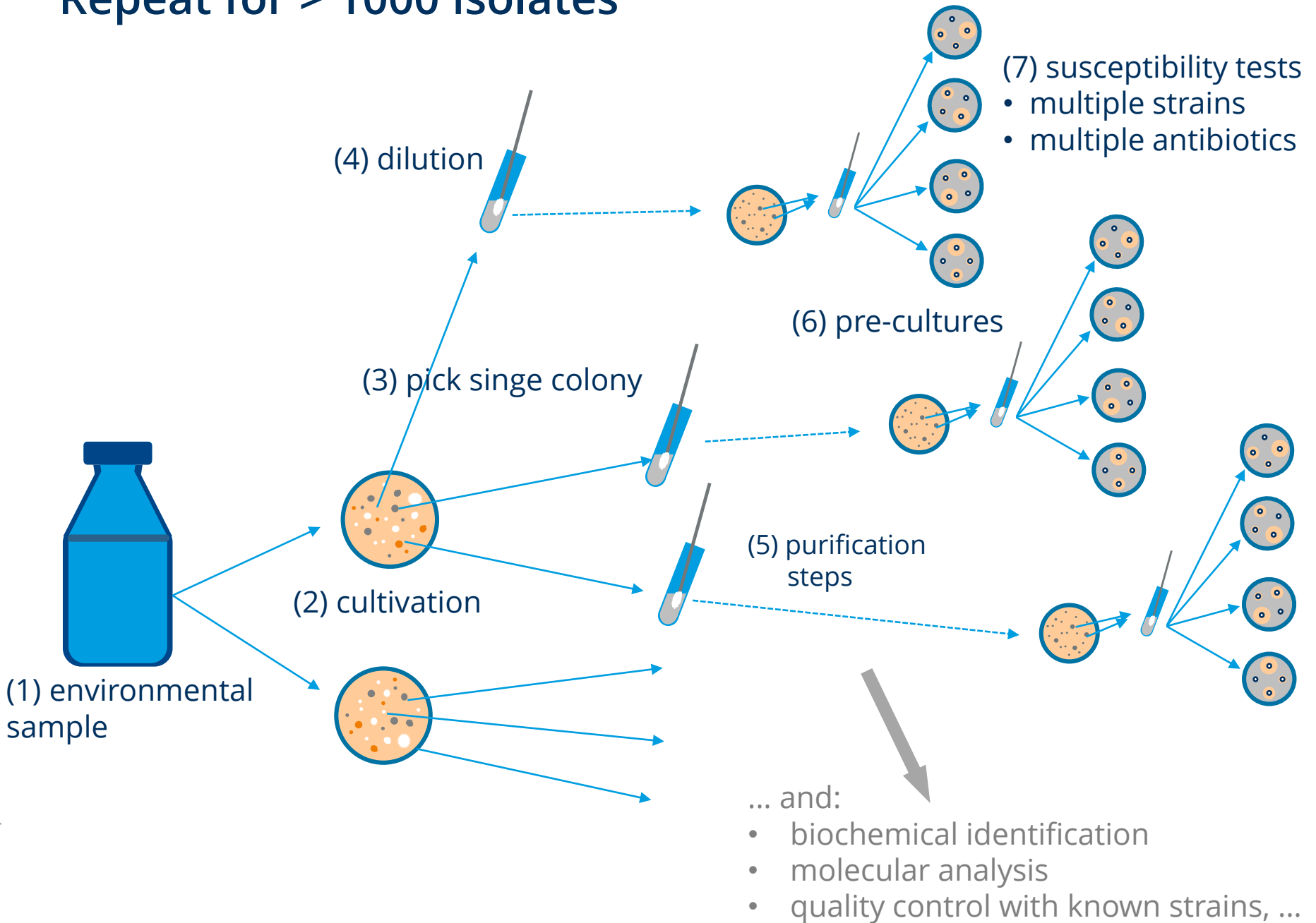
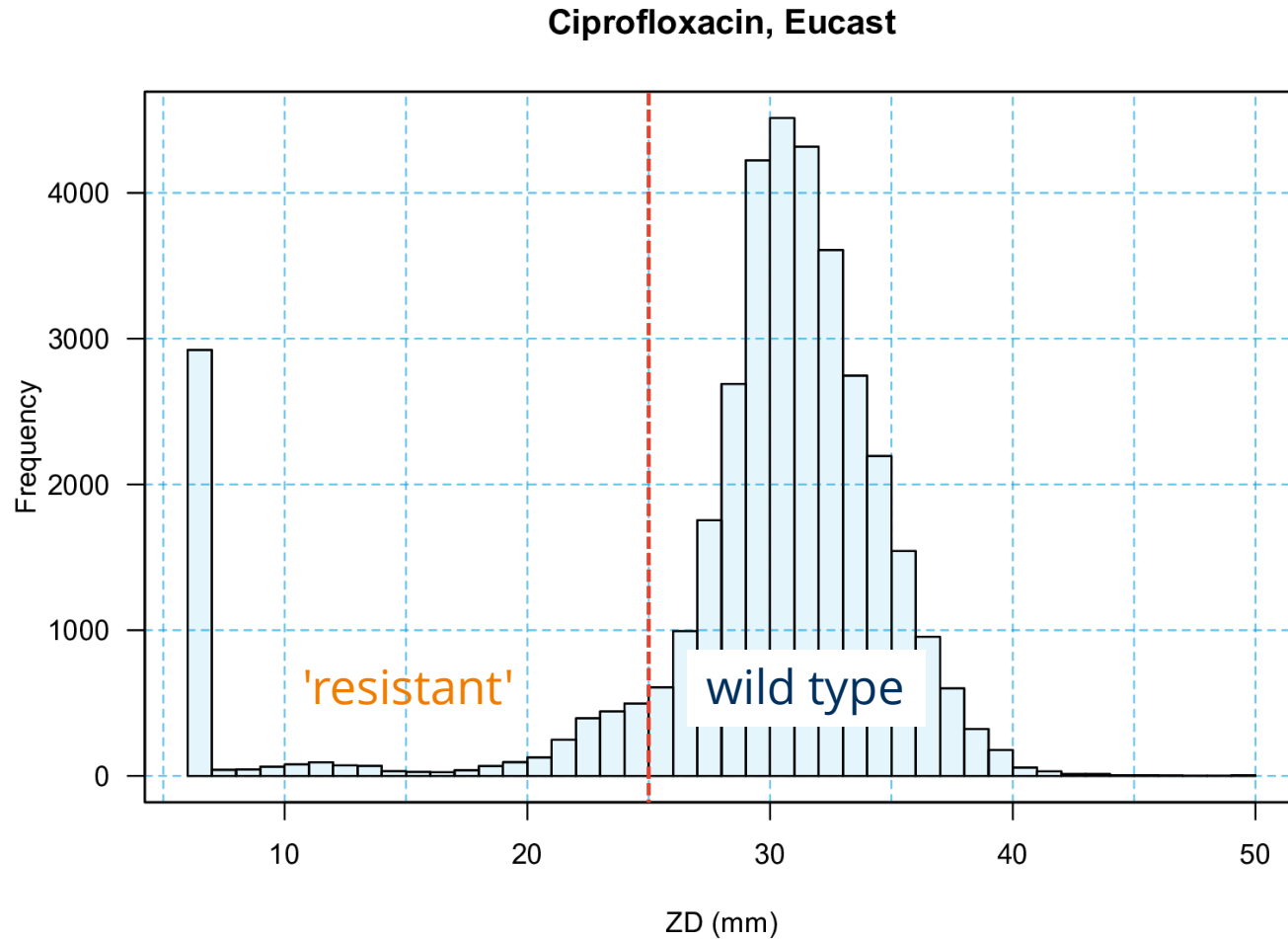


Image:  
Ioannis Kampouris, Institute of Hydrobiology  
Standard: EUCAST 2015-01-01

# Repeat for > 1000 isolates



# Zone diameter test repeated thousands of times → multi-modal distribution

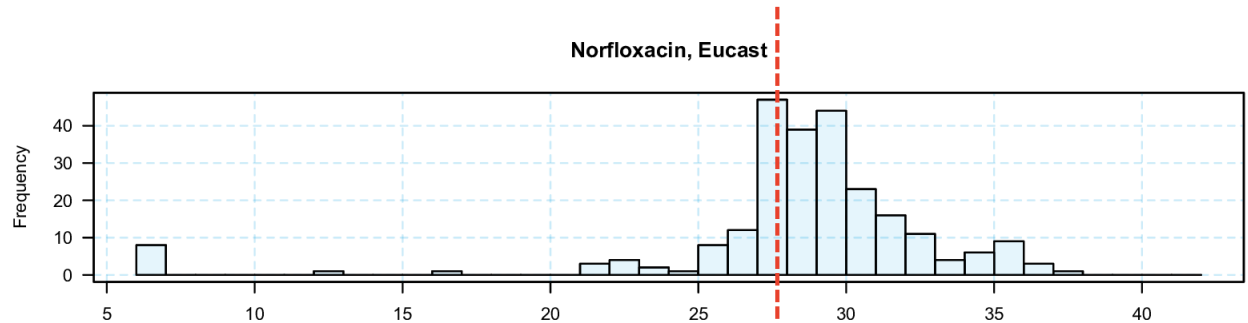


How to separate the sub-populations?

# Ecosystems, rivers, wastewater treatment:

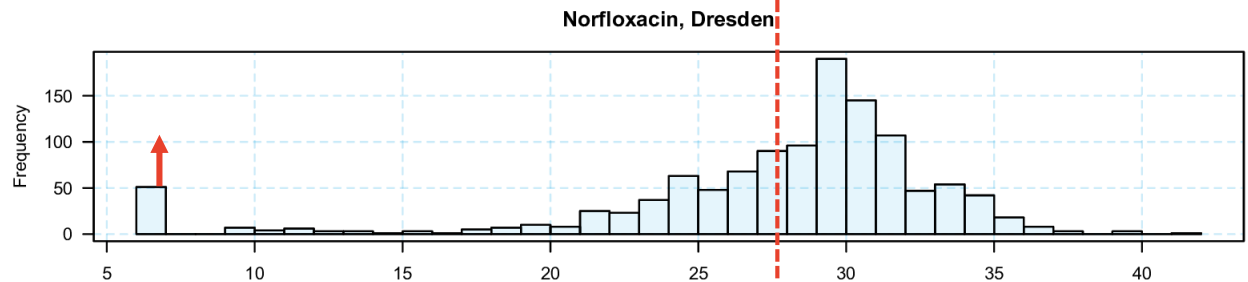
→ Transmission, selection, gene transfer

EUCAST  
Reference data

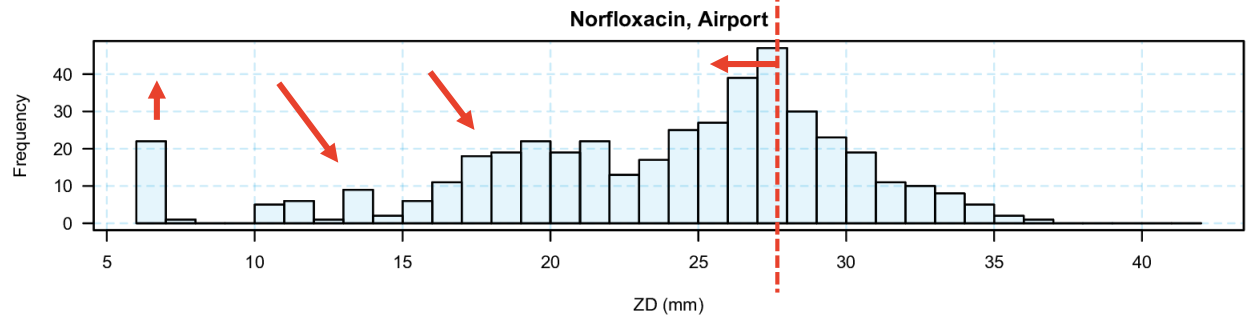


Own data

- Increase of 'resistant' fraction



- Sub-Populations
- Shift

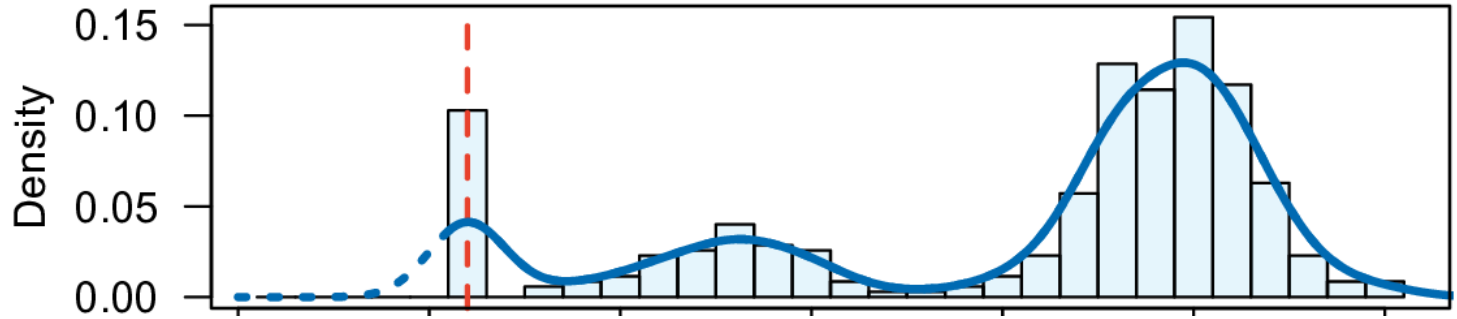


→ Reproducible indicators needed

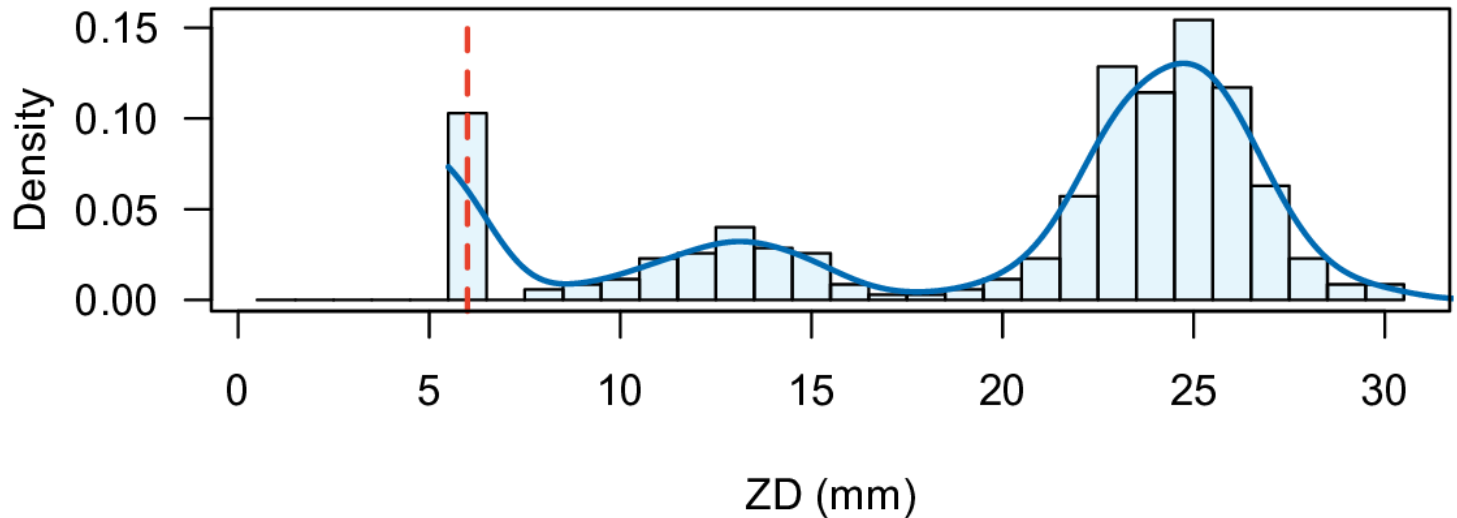


# Approach 1: Kernel density estimation

Gaussian



with  
boundary  
correction



→ allows estimation of quantiles (mode, 0.99, ...) and area

# Approach 2: ECOFFinder algorithm

ECOFF

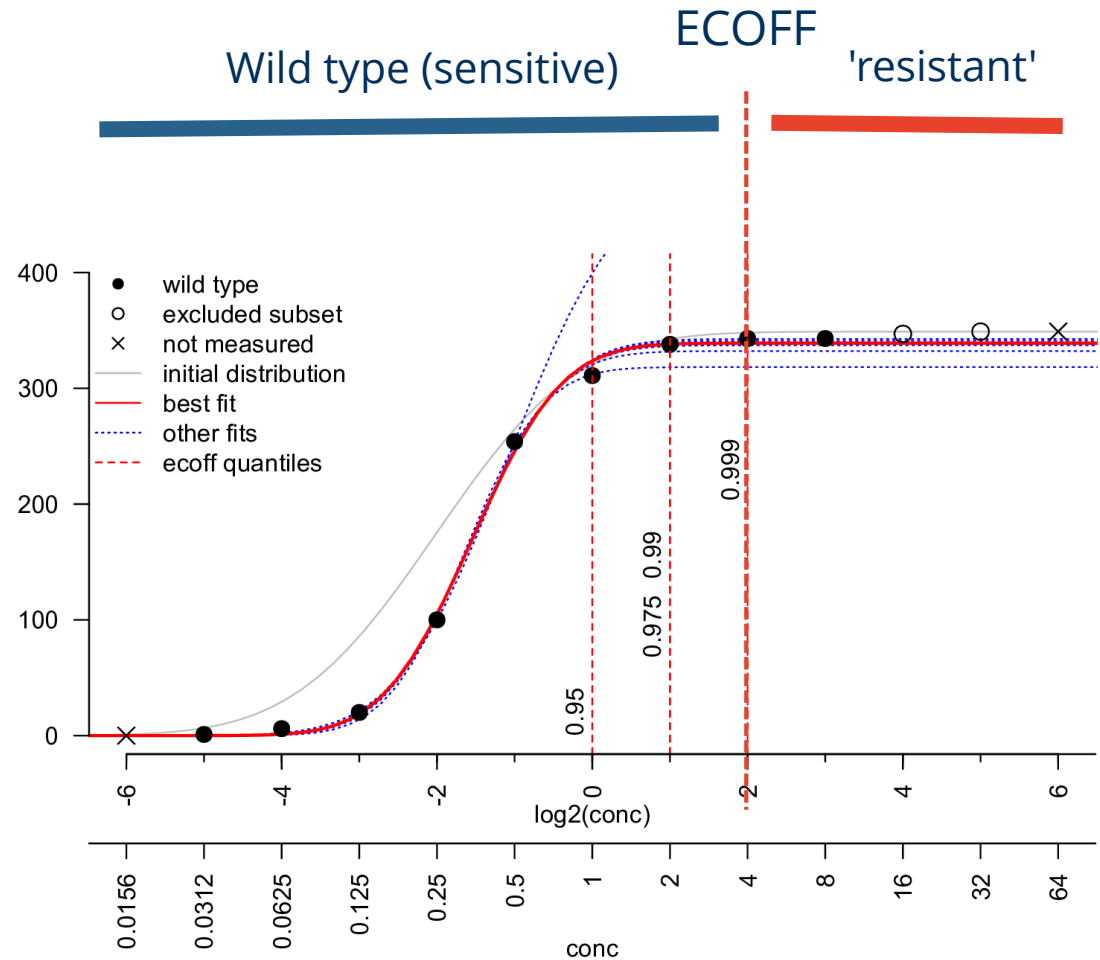
„epidemiological cut-off value“

Separates 2 groups

Software

Original: Excel VBA  
official EUCAST tool  
(Turnidge et al. 2006)

R/Shiny  
package antibioticR



<https://weblab.hydro.tu-dresden.de/ecoffinder/>

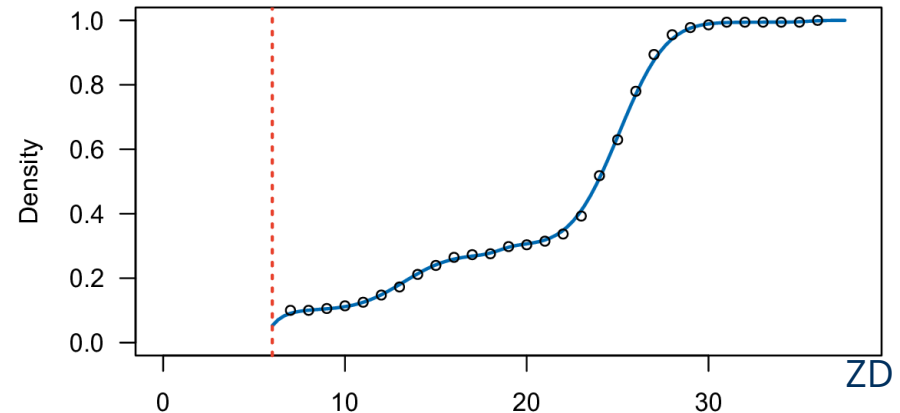
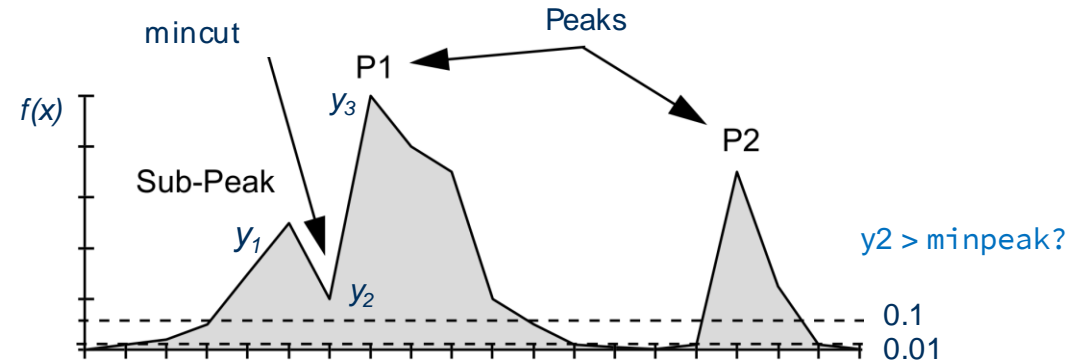
# Approach 3: Fit the complete mixture distribution

Step 1:  
peak hunting algorithm

Step 2:  
Maximum likelihood estimation  
for binned data  
(personal thanks to Brian Ripley)

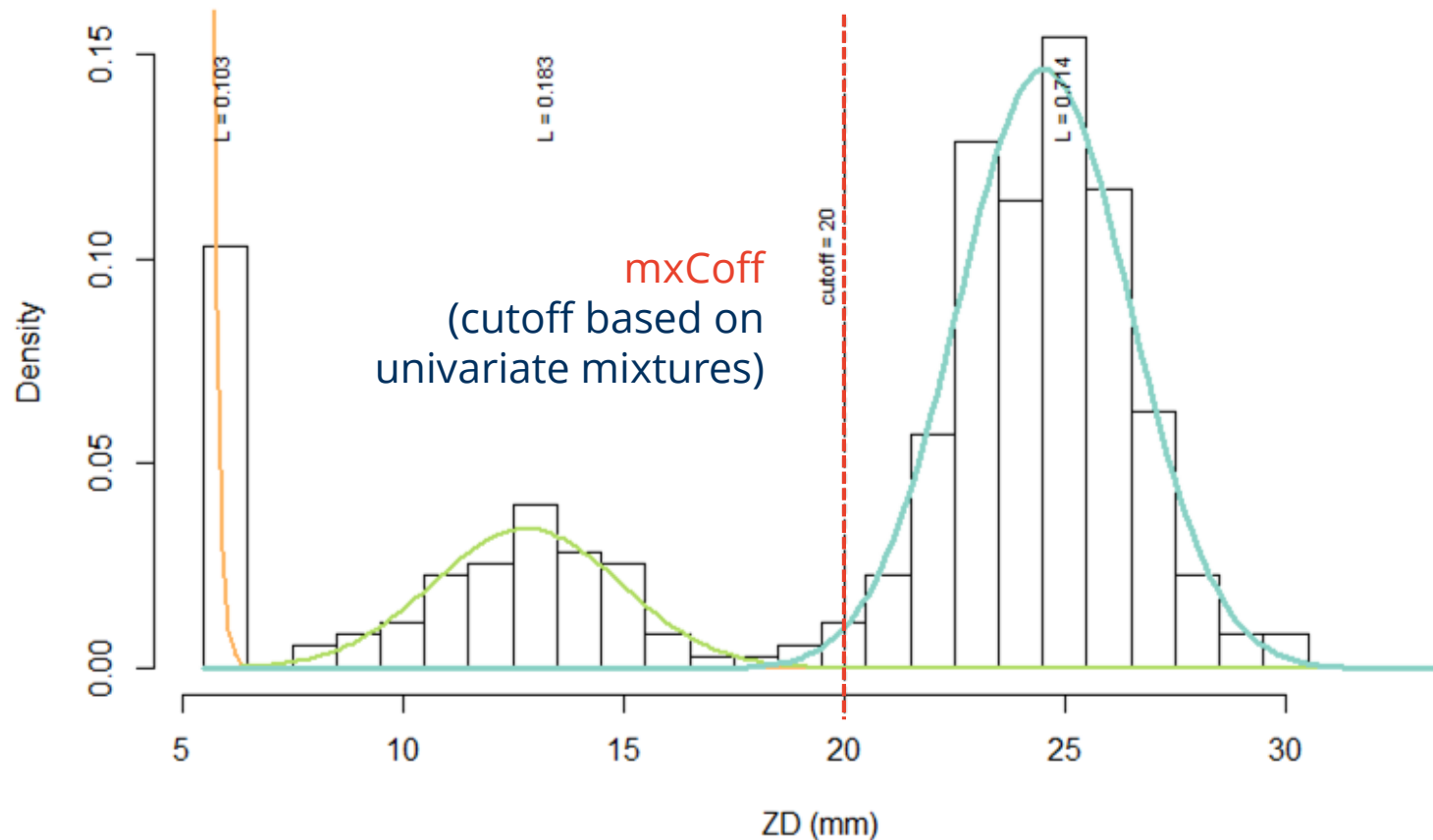
Leftmost component can be exponential,  
all others normal distributions

en, nn, enn, nnn, ennn, ....., ennnnn



# Result

## Univariate mixture with overlapping components Quantiles of all distribution components Plotting functions

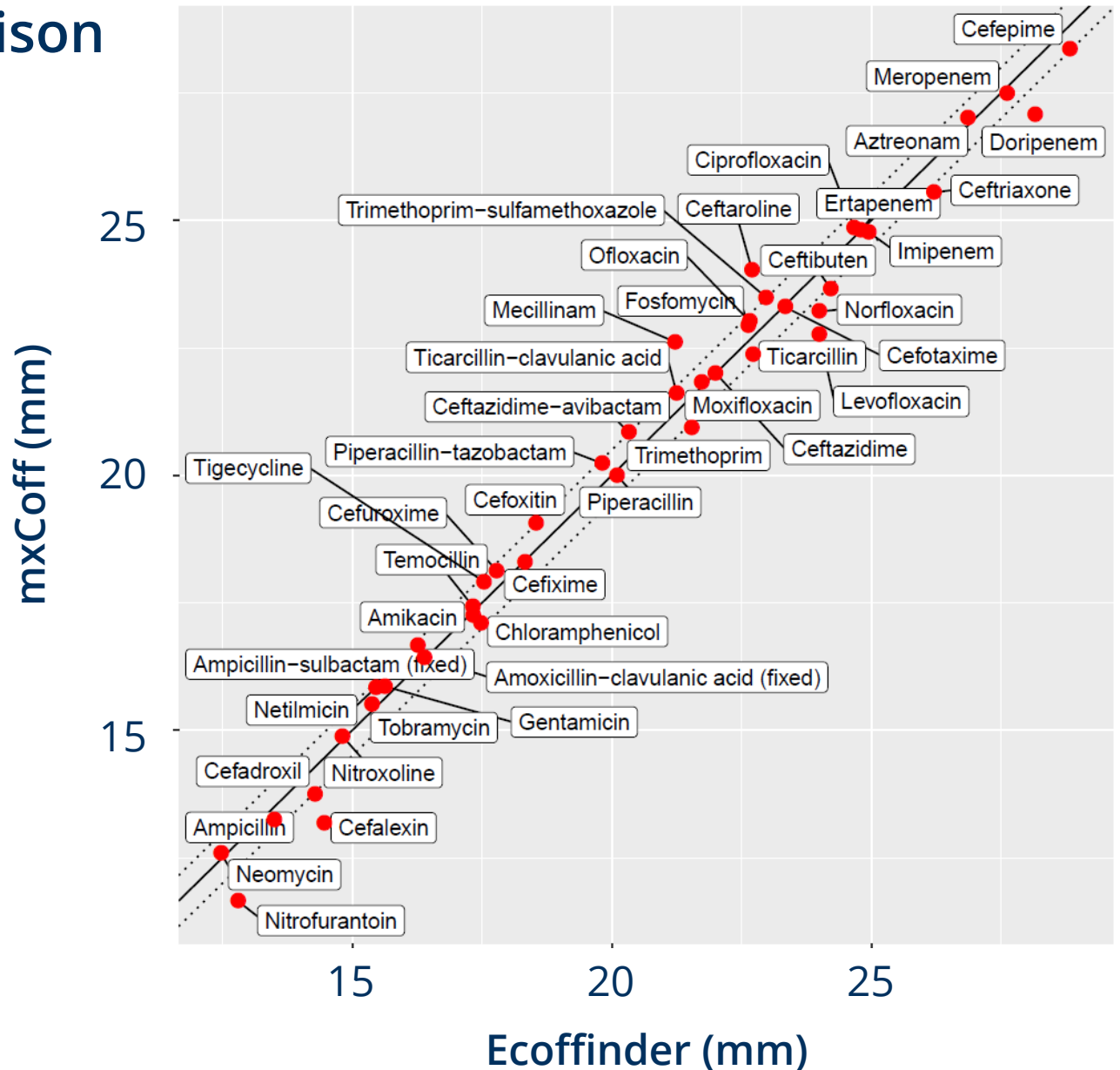


ZD distribution with resistant (orange), intermediate (green) and wild-type sub-population (blue), L = proportions of the components, cutoff = 1% quantile of the wild type

# Method comparison

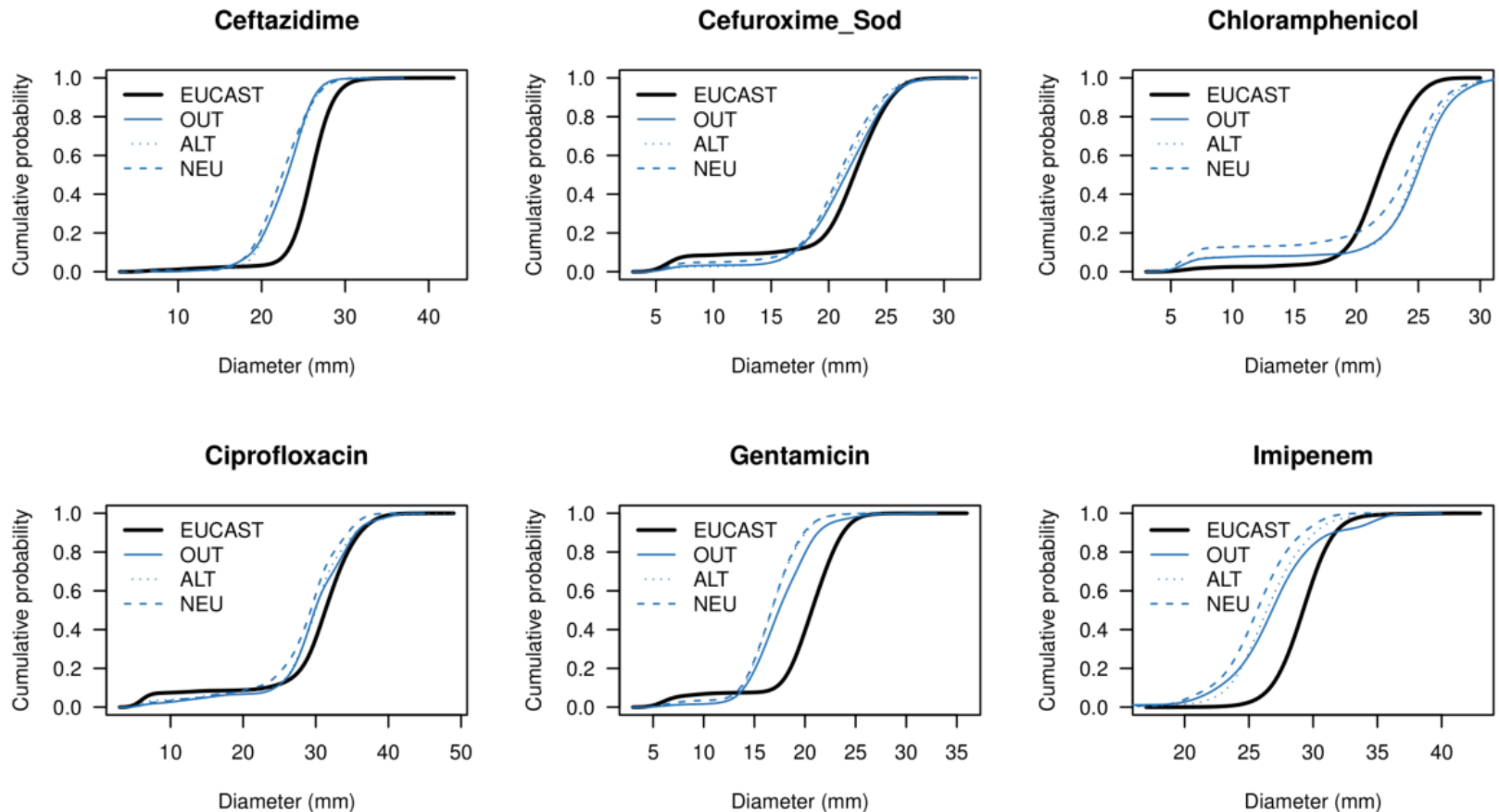
## Own method

- Automatic
- Scriptable
- All distribution components



Both methods available in antibioticR

# Comparison between own data from a sewer system with EUCAST reference data from clinical populations



Hypothesis, that the wild type of bacteria in a sewer system shifted to higher resistance with respect to common antibiotics.

(E. coli, Sewer System of Dresden, Germany, Data: Project antiResist)

# Questions?

<https://github.com/tpetzoldt/antibioticR>

<https://weblab.hydro.tu-dresden.de/ecoffinder/>