



Veterinary Epidemiology 2

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WOAH Collaborating Centre
for Food Safety



World Organisation
for Animal Health
Founded as OIE

Screening



- Purpose
 - To screen out the individuals with high risk of a disease from apparently healthy population
 - Early detection is effective
 - For diseases which have severe symptoms, but the probability of cure is high if the treatment is provided during the early phase
 - For infectious diseases that spread into wide areas through emission of large number of the pathogen before the hosts show clinical sign

Indicators of diagnostic test validity

		True status		Total
		Infected	Non-infected	
Test results	Positive	a	b	a+b
	Negative	c	d	c+d
	Total	a+c	b+d	a+b+c+d

False positives (arrow from 'b' to 'a+b')

False negatives (arrow from 'c' to 'a+c')

Sensitivity: probability of truly diseased individuals that are diagnosed positive
 $a/(a+c)$

Specificity: probability of truly non-diseased individuals that are diagnosed negative
 $d/(b+d)$

Positive predictive value: probability of positively diagnosed individuals are diseased
 $a/(a+b)$

Negative predictive value: probability of negatively diagnosed individuals are not diseased
 $d/(c+d)$

Trade off relationship between sensitivity and specificity

- Shifting cut off line toward left $\Rightarrow$ sensitivity $\uparrow$, specificity $\downarrow$
- Shifting cut off line toward right $\Rightarrow$ sensitivity $\downarrow$, specificity $\uparrow$

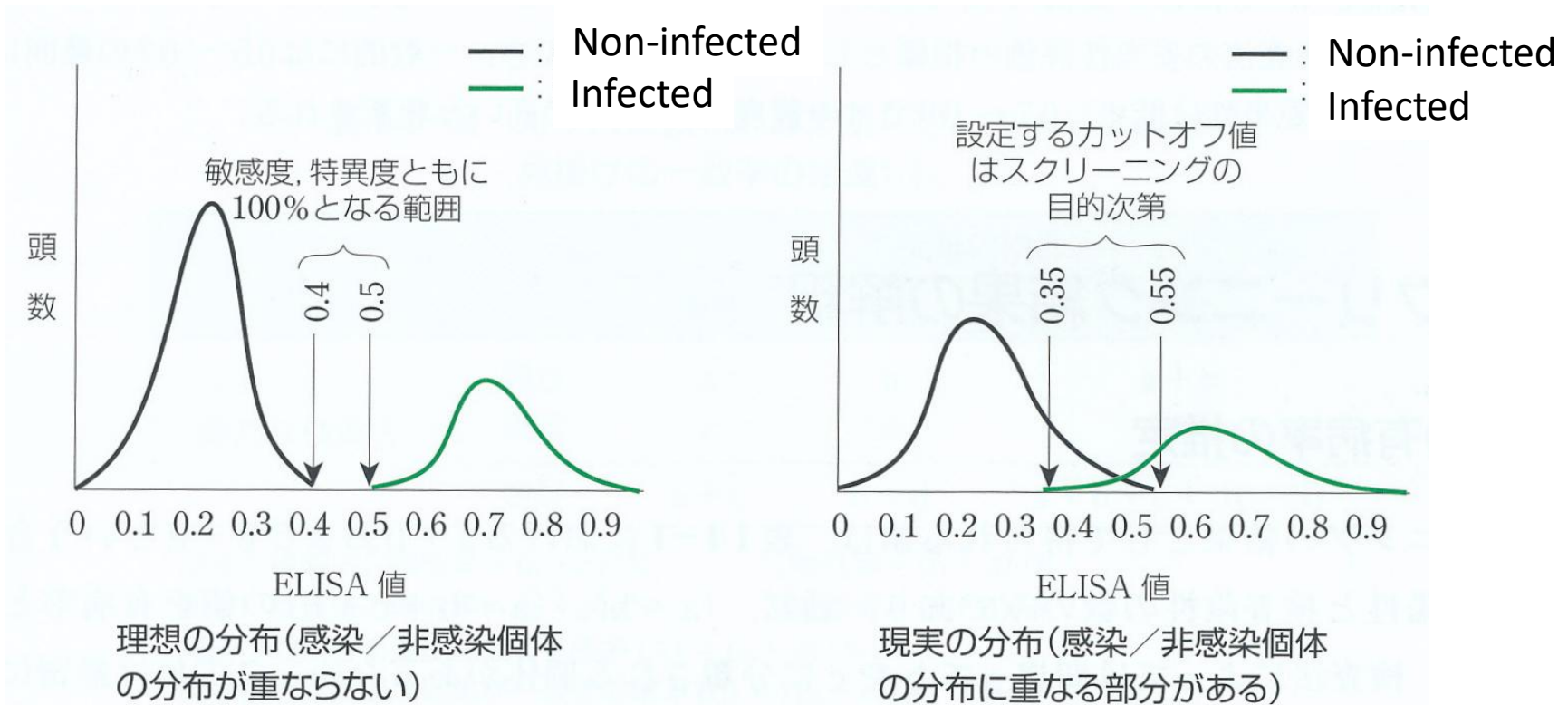


図 14-1 敏感度和特異度の関係(トレードオフ)

Receiver operating characteristic curve (ROC)

Better diagnostic tool

Curve goes through closer to the top left corner

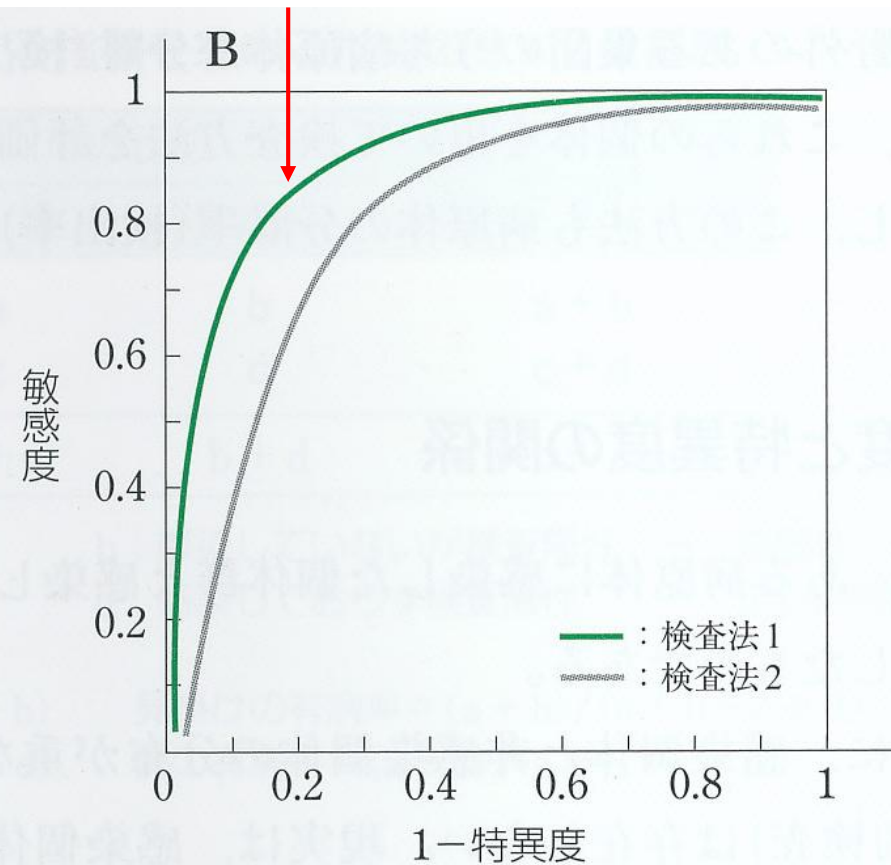
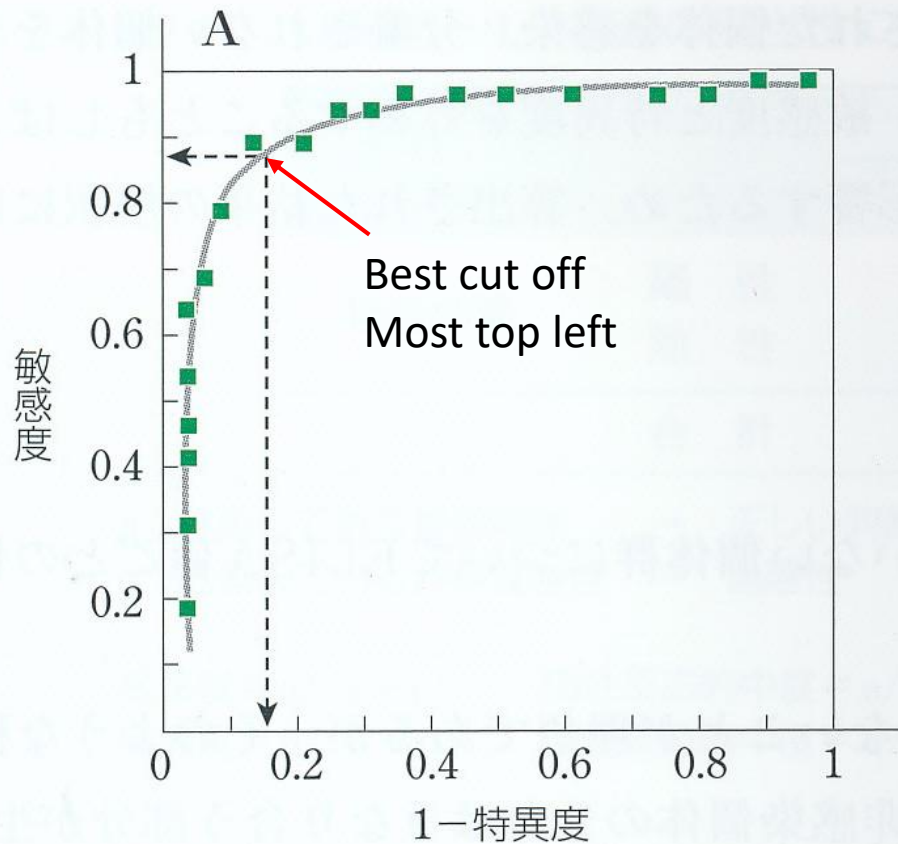
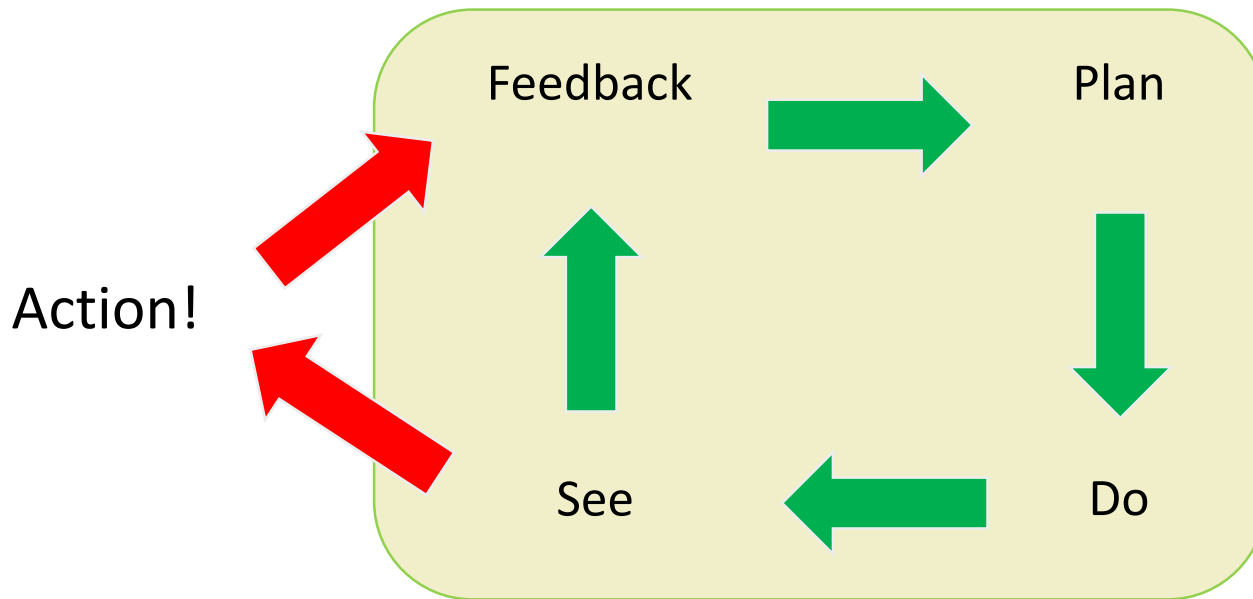


図 14-2 ROC 曲線とその利用

Surveillance

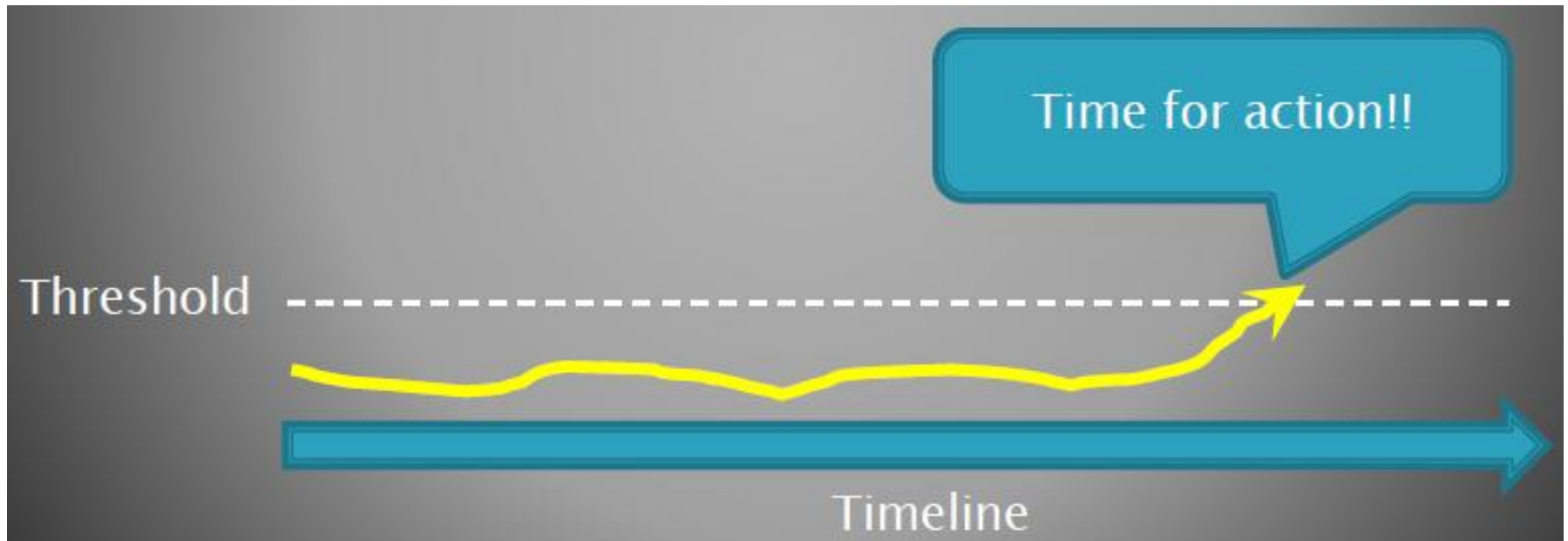
- Systematic and continuous **collection**, **analysis**, and **interpretation of data**, closely integrated with the timely and coherent **dissemination of the results** and **assessment** of those who have the right to know so that **action can be taken**



* Surveillance should not be confused with a survey, which is to collect information.

Another definition of surveillance

- Continuous collection, analysis, and feedback of data so that action can be taken when prevalence or incidence **exceeded the threshold**



Five components of surveillance

- Continuous collection of information and evaluation
- Clear definition of target population
- Clear definition of a case (diagnostic criteria)
- Timely publication of information
- A survey or application of information to control the emerged disease

Types of surveillance

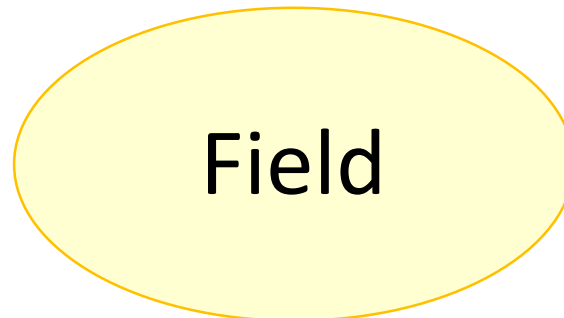
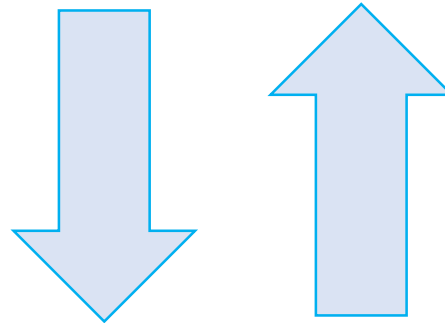


Active surveillance

- Veterinary authority actively collects information for a specific purpose

Passive surveillance

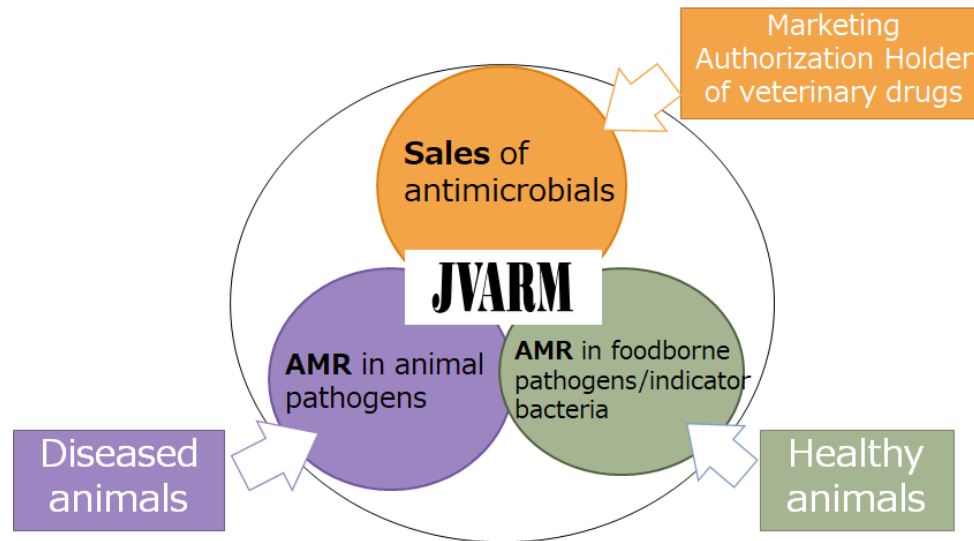
- Based on reports



Monitoring



- The intermittent performance and analysis of **measurements** aimed at **detecting changes** in the health status of populations or in the physical or social environment.
- **Surveillance is 'continuous' and involves action.*



*AMR: antimicrobial resistance

Japanese Veterinary Antimicrobial Resistance Monitoring System (JVARM)

Response of the world against Swann Report

Transparency, prudent use, and risk assessment →

Gradual AMU reduction as a growth promoter in EU in 1999-2006. Ban in 2006.

1969

Swann Report

UK



1971

Ban of penicillin and tetracycline use in feeds. Antimicrobial use in animals increased.

1993

Approval of FQ in chicken feed. Sharp increase in FQ resistant *Salmonella* in humans.

2007

Advisory Committee on Antimicrobial Resistance and Healthcare Associated Infection (ARHAI)

Sweden



1986

Ban of antimicrobials as a growth promoter.

1995

Joined in EU. Requesting rigorous AMU control to EU.

2000

Swedish Veterinary Antimicrobial Resistance Monitoring (SVARM)

Denmark



1995

Danish Integrated Antimicrobial Resistance Monitoring and Research Programme (DANMAP)
Ban of avoparcin associated with vancomycin resistance.

USA



1996

National Antimicrobial Resistance Monitoring System (NARMS)

2000

FDA quantitative risk assessment for FQ resistant *Campylobacter* in chicken. FQ was banned in 2005.

Japan



1973

Discovery of R plasmid

1976-1977, 1992-1994

MAFF nation-wide AMR study

1999

Japan Veterinary Antimicrobial Resistance Monitoring System (JVARM)

1976

Distinguishing feed additive antimicrobials from feed additive

Treatment

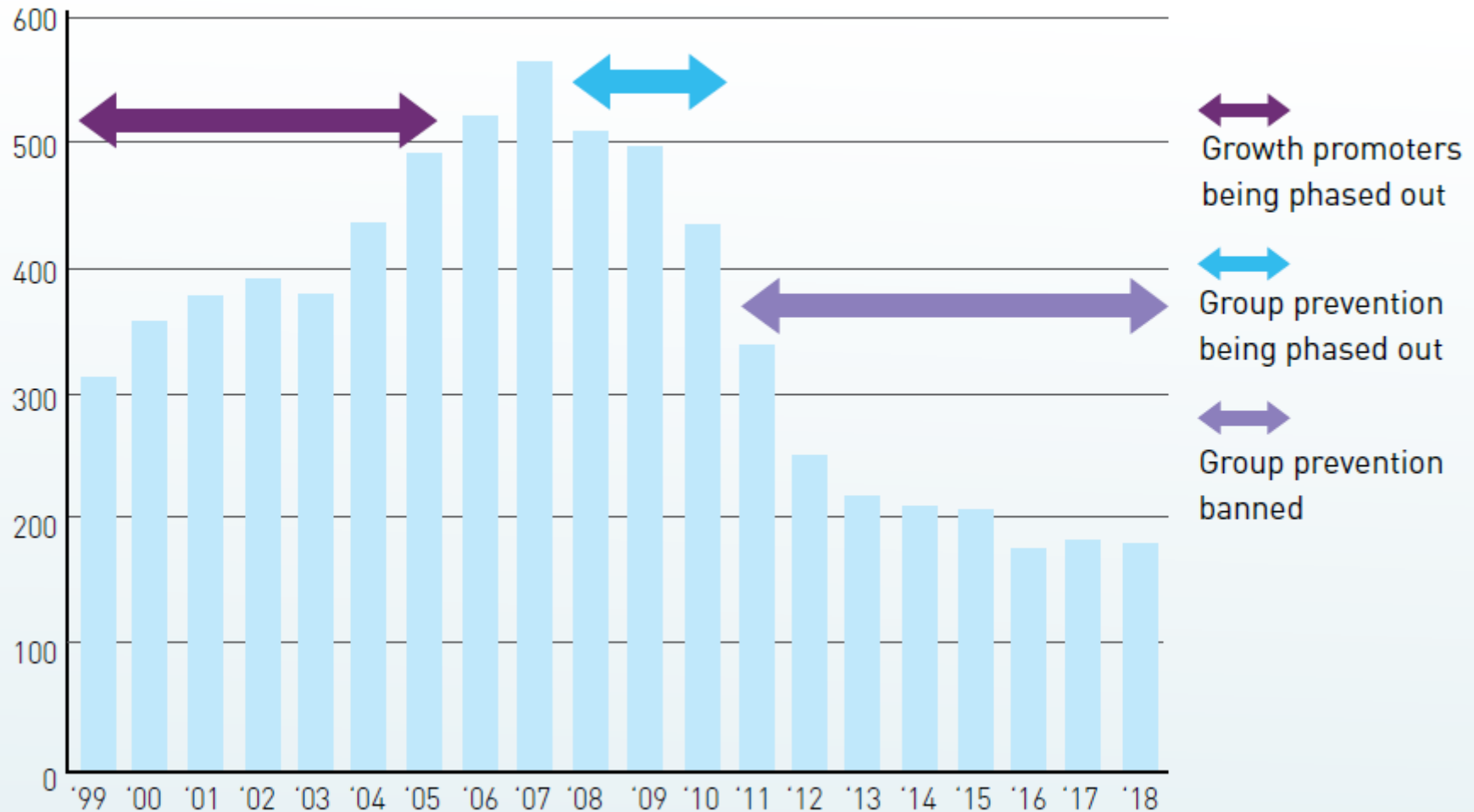
Growth promoter

1997

Ban of orienticin associated with vancomycin resistance.

The effect of regulating AMU as a growth promoter (the Netherlands)

Dutch farm antibiotic sales, 1999 to 2018 (tonnes of active ingredient)



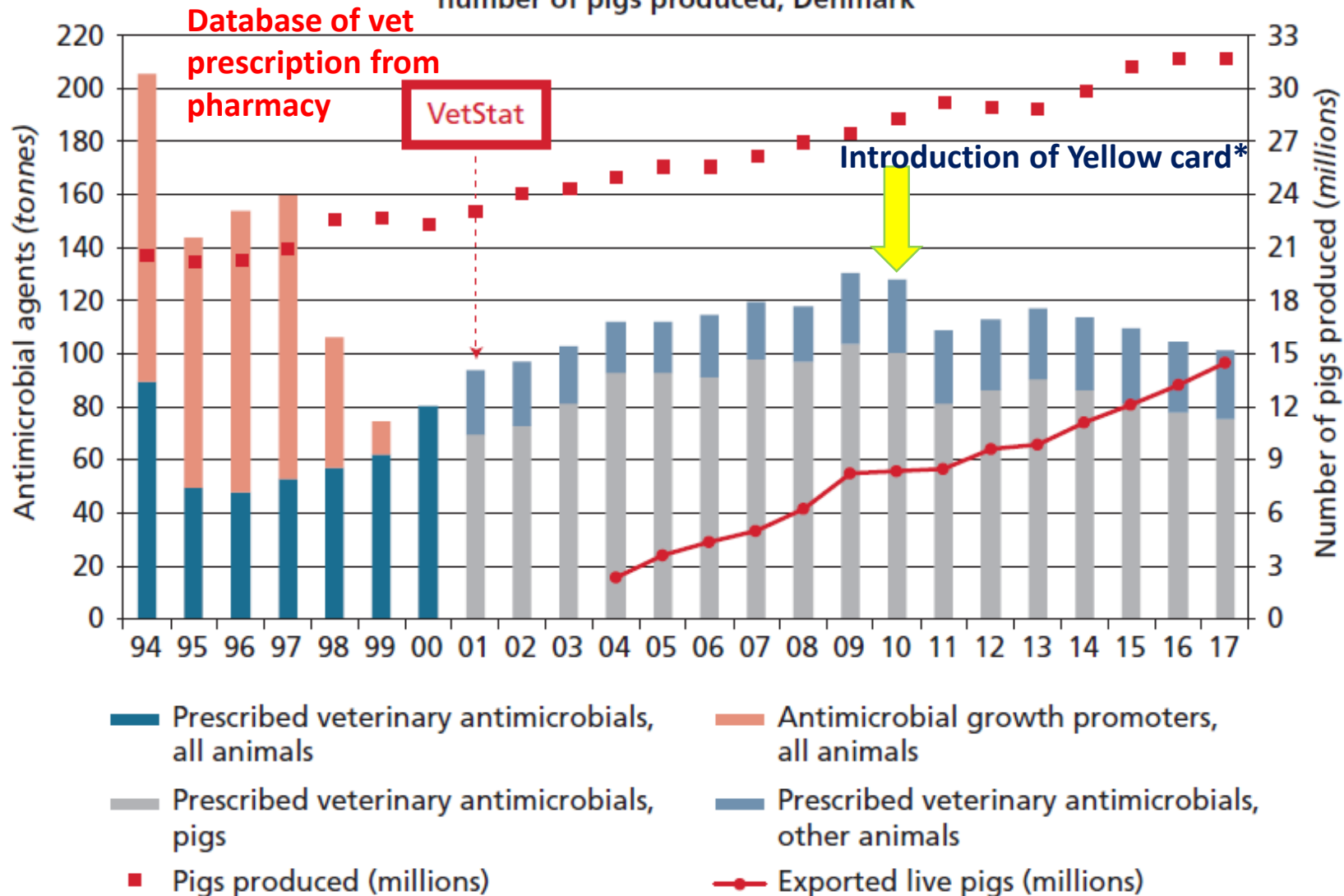
Success of Denmark

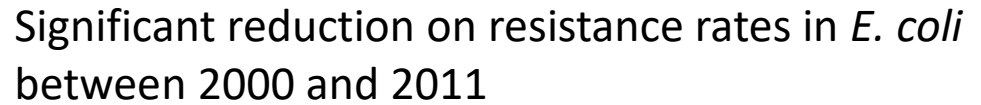
Yellow card scheme*

In case AMU is high,

- Regulation of oral AMU
- Mandatory vet guidance and cost share

Prescribed antimicrobial agents for all animal species and number of pigs produced, Denmark





The graph shows a line with several peaks and troughs, indicating fluctuations. A large red arrow points from the top left towards the bottom right, with the word "Pig" written above it.



Stacked bar chart showing the number of publications per year from 2003 to 2017, categorized by antibiotic class. The Y-axis represents the number of publications (0 to 200). The X-axis represents the year. The legend indicates the following categories: Others (cyan), Ionophores (purple), Macrolides (green), Tetracyclines (red), and Polypeptides (blue).

Year	Polypeptides	Tetracyclines	Macrolides	Ionophores	Others
2003	42	12	10	95	25
2004	45	10	10	95	25
2005	42	10	10	105	23
2006	40	10	10	105	25
2007	38	10	10	105	15
2008	40	10	10	105	20
2009	38	10	10	105	20
2010	40	10	10	135	20
2011	40	10	10	135	20
2012	40	10	10	135	20
2013	40	10	10	135	20
2014	38	10	10	135	20
2015	38	10	10	135	20
2016	38	10	10	155	20
2017	15	10	10	165	20

飼料添加物販売量の推移 (t) JVARM報告書

Japan Nosocomial Infections Surveillance (JANIS)

WHO Global Antimicrobial Resistance Surveillance System (GLASS)

JANIS

Clinical Laboratory (CL)

Prevalence of major bacterial species among clinical isolates, including antimicrobial susceptibility data (isolate based)

Surgical Site Infection (SSI)

Incidence of surgical site infections (patient based)

Intensive Care Unit (ICU)

Incidence of catheter-related bloodstream infection (CRBI), ventilator-associated pneumonia (VAP), and urinary tract infection in the ICU (patient based)



Antimicrobial-Resistant Bacterial Infection (ARBI)

Incidence of infections with six major antimicrobial-resistant bacteria (patient based)

Neonatal Intensive Care Unit (NICU)

Incidence of all infections in the NICU (patient based)

Annual National One Health Report

Antibiogram

X病院 2018年1月～12月 アンチバイオグラム X病院AST 2019.3.7

菌名	ペニシリン	セフトリアキソン	セフェム	カラムバクシム	アミノグリコ	テトラサイクリン	マクロライド	その他
Staphylococcus aureus (MRSA)	100	100	100	100	100	100	100	100
Staphylococcus aureus (MSSA)	100	100	100	100	100	100	100	100
Coagulase-negative Staphylococcus	100	100	100	100	100	100	100	100
Streptococcus pneumoniae	100	100	100	100	100	100	100	100
Enterococcus spp.	100	100	100	100	100	100	100	100
Enterococcus faecalis	100	100	100	100	100	100	100	100
Enterococcus faecium	100	100	100	100	100	100	100	100
Escherichia coli	100	100	100	100	100	100	100	100
Escherichia coli (E-DELT)	100	100	100	100	100	100	100	100
Klebsiella pneumoniae	100	100	100	100	100	100	100	100
Enterobacter cloacae complex	100	100	100	100	100	100	100	100
Pseudomonas aeruginosa	100	100	100	100	100	100	100	100
Pseudomonas infestation	100	100	100	100	100	100	100	100



Sales of antimicrobials

JVARM

AMR in animal pathogens

AMR in foodborne pathogens/indicator bacteria

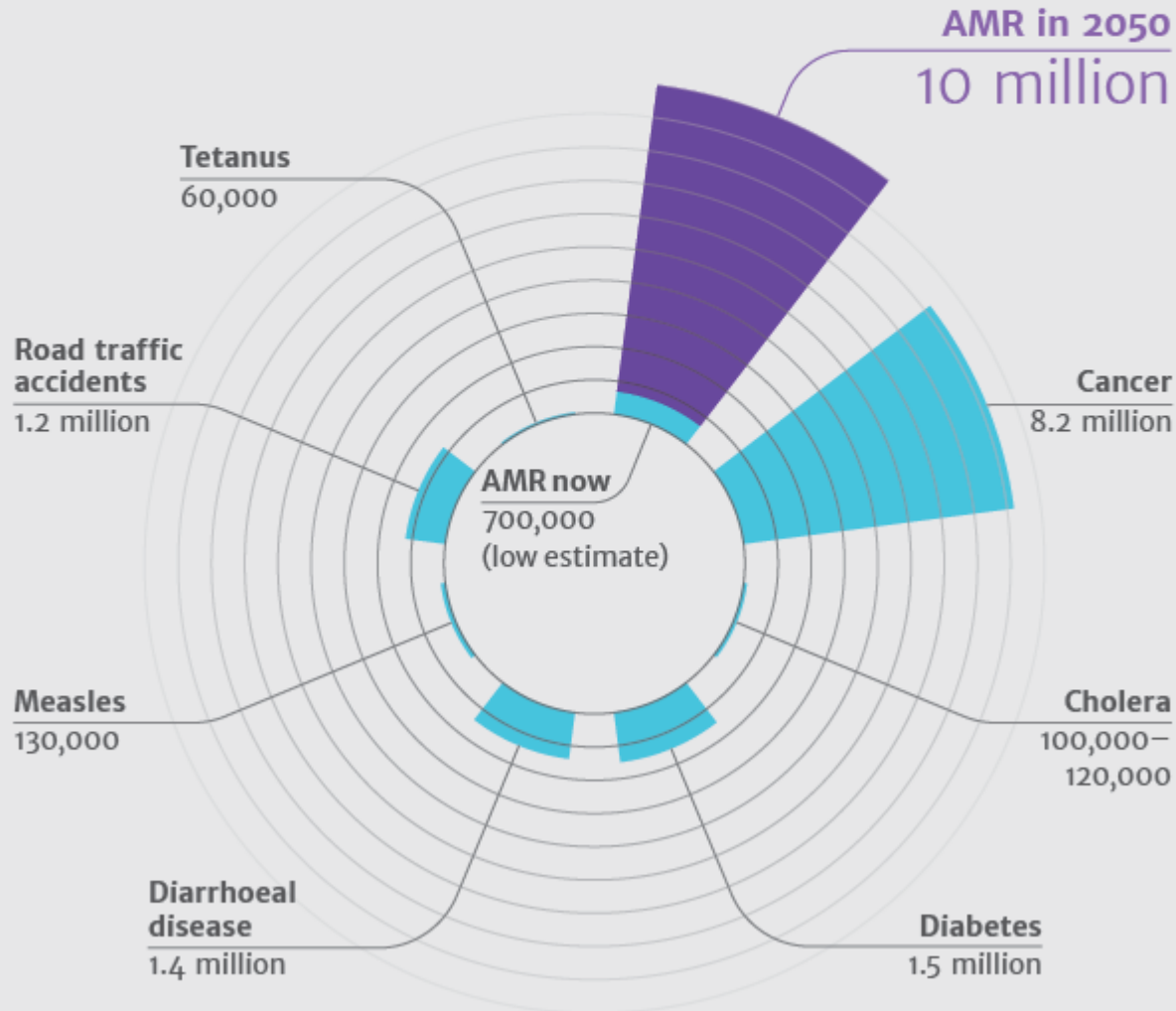
Diseased animals

Healthy animals

*AMR: antimicrobial resistance

**Deaths attributable
to AMR every year**
compared to other
major causes of death

In 2014, deaths due to AMR
were estimated to exceed
those of cancer in 2050
(GDP reduction by 2-3.5%)



Antimicrobial Resistance: Tackling a crisis for the
health and wealth of nations.
The Review on Antimicrobial Resistance, Chaired
by Jim O'Neill. 2014. UK.

In 2015



GLOBAL ACTION PLAN ON ANTIMICROBIAL RESISTANCE

- to improve awareness and understanding of antimicrobial resistance through effective communication, education and training;
- to strengthen the knowledge and evidence base through surveillance and research;
- to reduce the incidence of infection through effective sanitation, hygiene and infection prevention measures;
- to optimize the use of antimicrobial medicines in human and animal health; and
- to develop the economic case for sustainable investment that takes account of the needs of all countries and to increase investment in new medicines, diagnostic tools, vaccines and other interventions.

Basic statistics in veterinary epidemiology

The aims to achieve

- To be able to explain types of data, test statistics and distribution
- To be able to understand and apply estimation and tests
 - Hypothesis testing
 - Tests for means
 - Tests for proportions
 - Tests for relationships between variables

Types of data

- Quantitative data

- Presented with numbers
- Age, body weight, blood pressure, biochemistry test values (**continuous** variable)
- Daily case count, white blood cell count, somatic cell count, the number of animals (**count** variable)
- Rank



- Qualitative data

- Status or attribution to categories
- Sex, infection status, exposure status (**binary** variable)
- Breeds, city/town names, and sociological attribution (**categorical** variable)



Data storage

Farm level data



A1 fx farm								
	A	B	C	D	E	F	G	H
1	farm	dipping	teat_dis	stall	sapos	saneg		
2	A	k	sz	t	11	91		
3	B	k	sz	f	38	201		
4	C	b	sk	t	4	95		
5	D	b	sz	t	1	70		
6	E	b	sz	t	13	72		
7	F	k	sk	t	19	85		
8	G	b	sk	f	2	81		
9	H	b	sk	t	13	116		
10	I	k	na	t	21	120		
11								
12								
13								
14								
15								

Category

The numbers of cows

Data storage

Individual animal level data

	A	B	C	D	E	F	G	H	I	J	K	L	M
1	farmer	cow	teat	SA	dip	dis	stall						
2	A	A108	A108a	0	b	sz	t						
3	A	A108	A108b	0	b	sz	t						
4	A	A108	A108c	0	b	sz	t						
5	A	A108	A108d	0	b	sz	t						
6	A	A114	A114a	1	b	sz	t						
7	A	A114	A114b	0	b	sz	t						
8	A	A114	A114c	0	b	sz	t						
9	A	A114	A114d	0	b	sz	t						
10	A	A120	A120a	1	b	sz	t						
11	A	A120	A120b	0	b	sz	t						
12	A	A120	A120c	0	b	sz	t						
13	A	A120	A120d	0	b	sz	t						
14	B	B121	B121a	1	b	sz	t						
15	B	B121	B121b	1	b	sz	t						
16	B	B121	B121c	0	b	sz	t						
17	B	B121	B121d	0	b	sz	t						
18	B	B128	B128a	0	b	sz	t						
19	B	B128	B128b	0	b	sz	t						
20	B	B128	B128c	0	b	sz	t						
21	B	B128	B128d	0	b	sz	t						
22	C	C132	C132a	0	b	sz	t						
23	C	C132	C132b	0	b	sz	t						
24	C	C132	C132c	0	b	sz	t						
25	C	C132	C132d	0	b	sz	t						

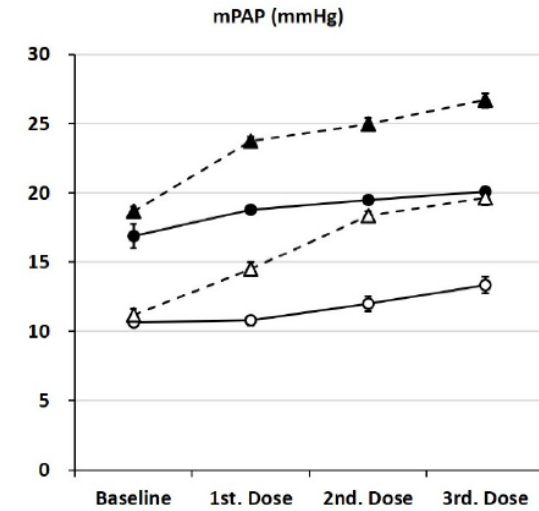
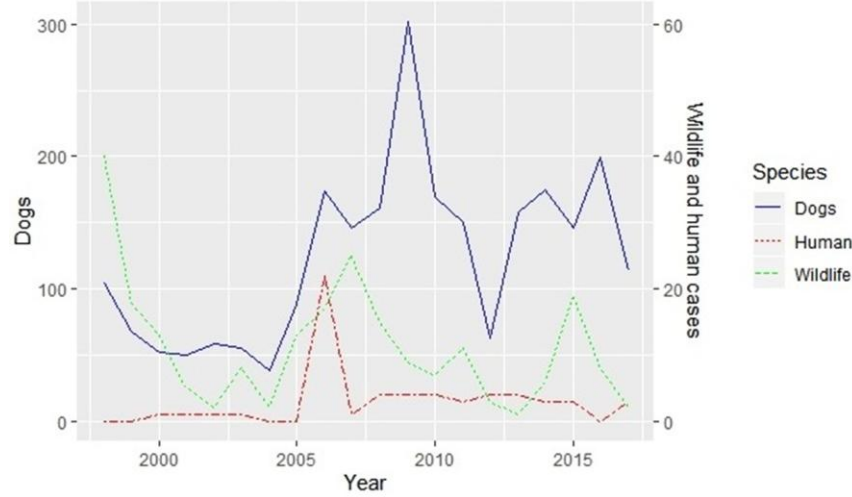
Binary data/count data
(The number of mastitis occurrence)

Left front/ left rear/ right front/ right rear

Data observation

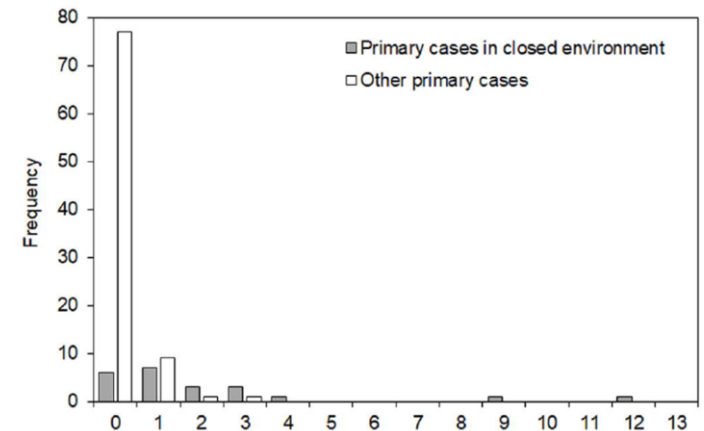
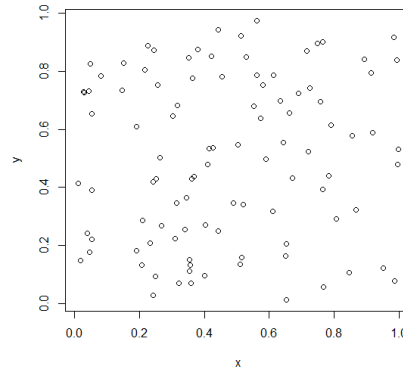
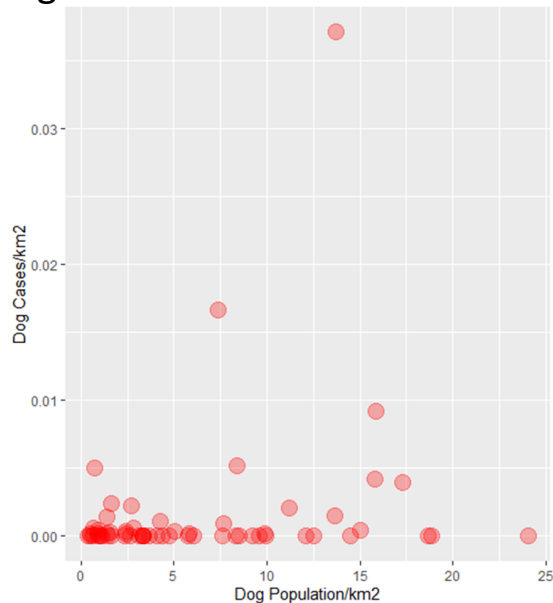
-Your eyes can tell hypotheses-

Rabies in South Africa



The effects of colforsin and dobutamin on mean pulmonary artery pressure in normal and acidic conditions (Itami and Makita et al. PLOS ONE 2020)

Dog rabies in South Africa



Nishiura et al. 2020. The numbers of secondary cases in Covid 19

Normal distribution

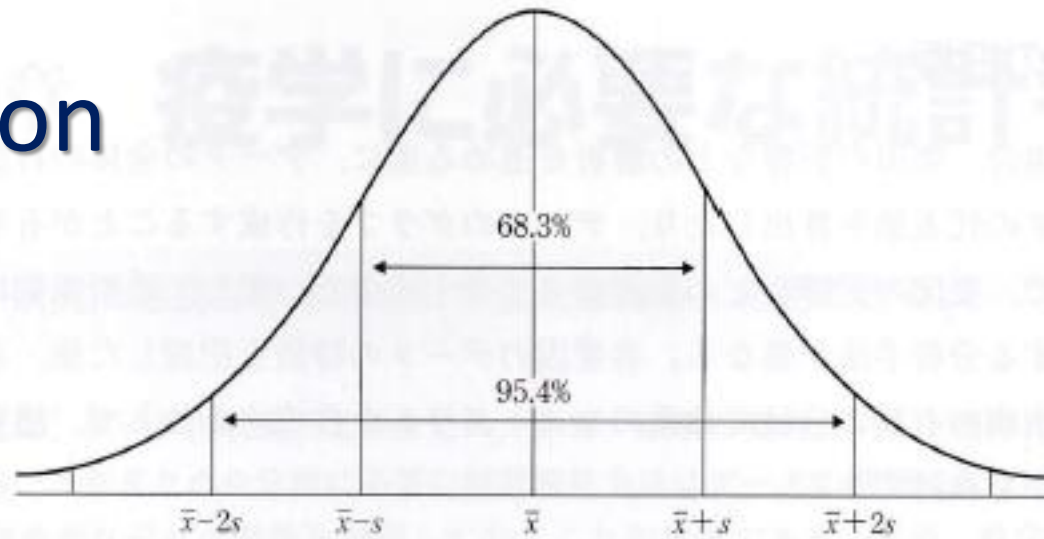
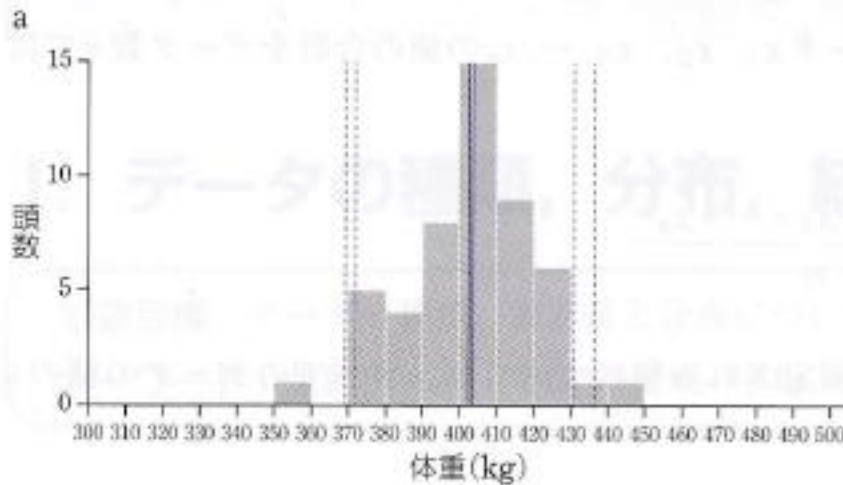
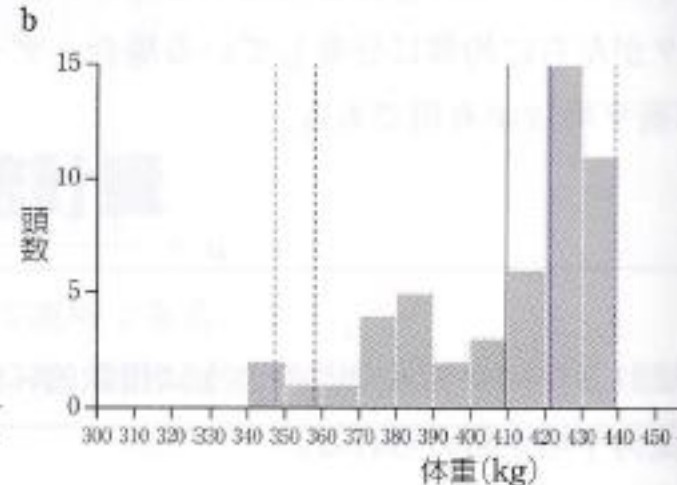


図10-1 正規分布の平均と標準偏差の関係



Data following normal distribution



Data not following normal distribution

Visualizing data

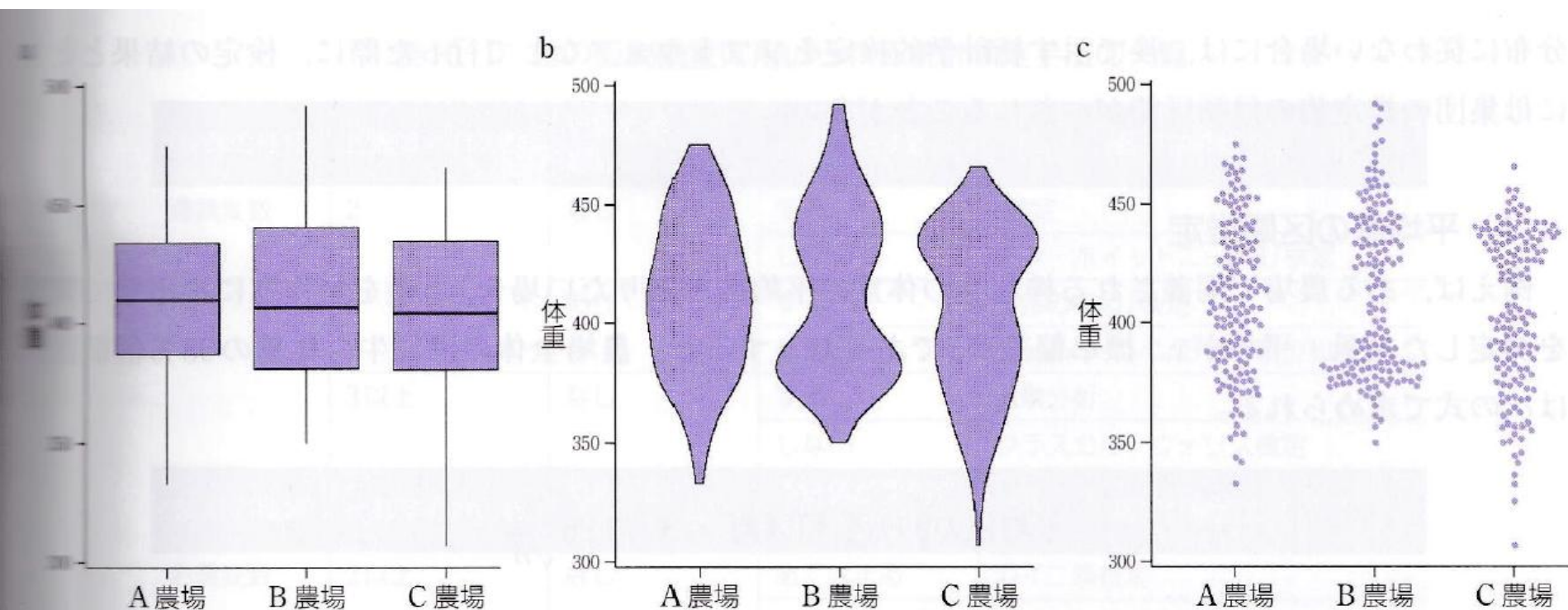


図10-3 各農場の動物の体重分布図を箱ひげ図(a), バイオリンプロット(b)およびビースウォームプロット(c)で表した

Description of the characteristics of data

- Example
 - In a cattle herd, birth body weights of 30 calves were measured.
 - Can you tell the mean by just an observation?

30.6	30.1	29.3	26.7	29.8
26.8	29.9	29.4	28.9	28.3
28.1	27.2	26.8	29.0	29.7
28.8	29.1	29.8	27.4	28.6
30.6	29.0	31.0	28.0	27.2
29.8	28.4	31.2	29.7	29.2

(単位 kg)

Description of the characteristics of data

- Yes, your eyes have a quantitative sense!
 - Mean: 28.9 kg
 - Standard deviation: 1.3 kg

```
> attach(calfBW)
> names(calfBW)
[1] "BW"
> sd(BW)
[1] 1.2591
> mean(BW)
[1] 28.94667
```

30.6	30.1	29.3	26.7	29.8
26.8	29.9	29.4	28.9	28.3
28.1	27.2	26.8	29.0	29.7
28.8	29.1	29.8	27.4	28.6
30.6	29.0	31.0	28.0	27.2
29.8	28.4	31.2	29.7	29.2

(単位 kg)

Central values: mean, median, and mode

- Mean

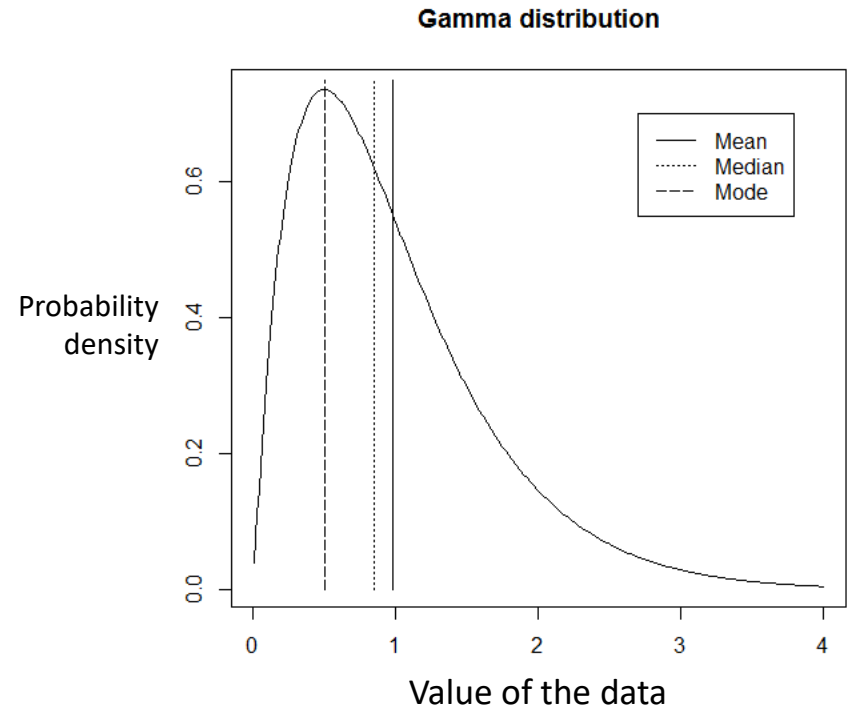
- Arithmetic mean, geometric mean, harmonic mean

- Median

- The central value when the data were ordered
- When data are even number ($n = 2m$), the mean of m^{th} and $m+1^{\text{th}}$ values
- Used when data are not normally distributed

- Mode

- The most observed value



Arithmetic mean

$$\bar{X} = \frac{X_1 + X_2 + \cdots + X_n}{n}$$

Geometric mean

*Used for data with outliers

$$\bar{X} = \sqrt[n]{X_1 \times X_2 \times X_3 \times \cdots \times X_n}$$

* In the previous example, the mean was 28.9 kg

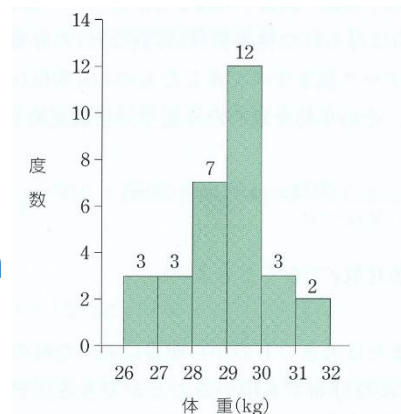


図15-1 例1のヒストグラム

There are two types of “width of a distribution”

- Variability

- Variation in a system
- Height is different among individuals
- Maximum temperature today is different from the same day last year



- Uncertainty

- Lack of knowledge
- Degree of uncertainty, or degree of confidence on true mean



Variability

- Variability of body weight was observed as a biological system of cattle
- Variability can be expressed using range of percentile

summary(BW)

Min.	1st Qu.	Median	Mean	3rd Qu.	Max.
26.70	28.15	29.05	28.95	29.80	31.20

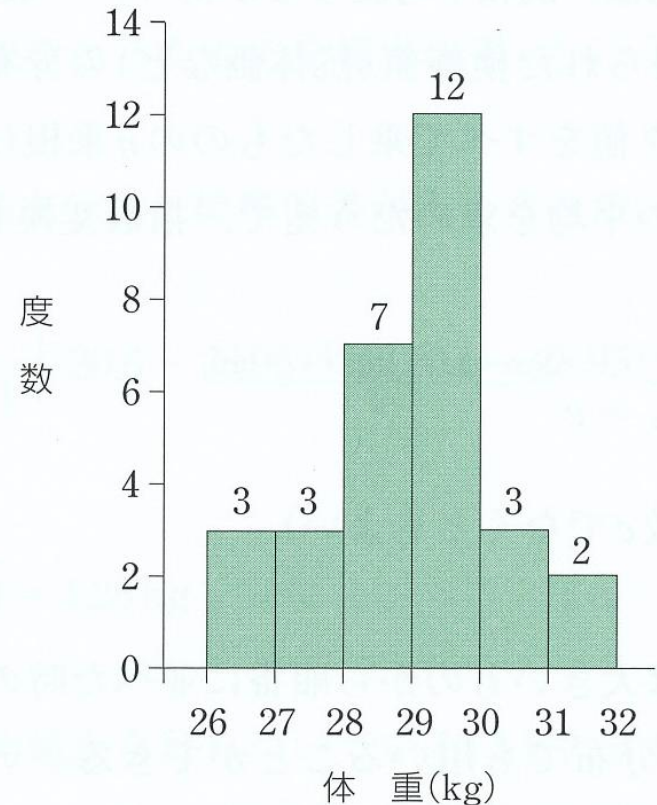


図15-1 例1のヒストグラム

* Percentile

- When data are placed in order from the smallest to largest value, the value at x% from the smallest

Indicator of variability

- Variance (s^2)

- Mean square of the difference between data x_i and the mean of x

$$s^2 = \frac{1}{n-1} \left\{ (x_1 - \bar{x})^2 + (x_2 - \bar{x})^2 + \cdots + (x_n - \bar{x})^2 \right\}$$

- Standard deviation (SD, s)

- A root of variance (original scale)

$$s = \sqrt{s^2}$$

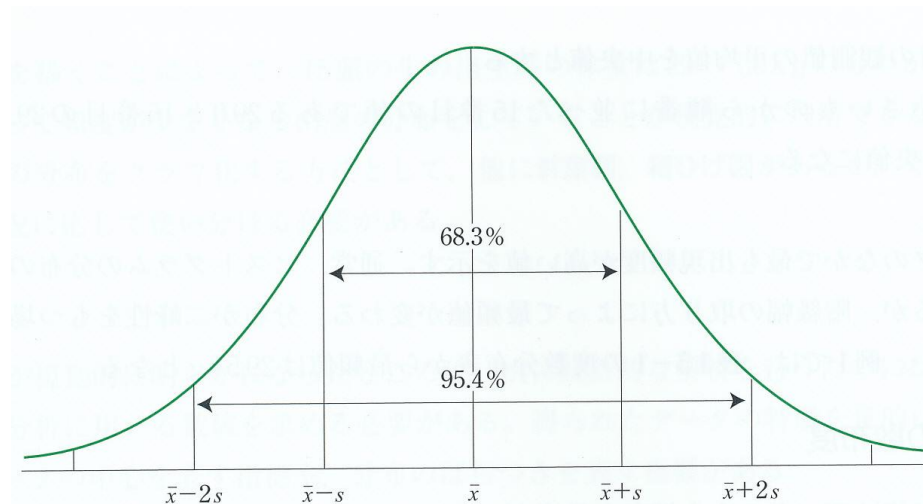
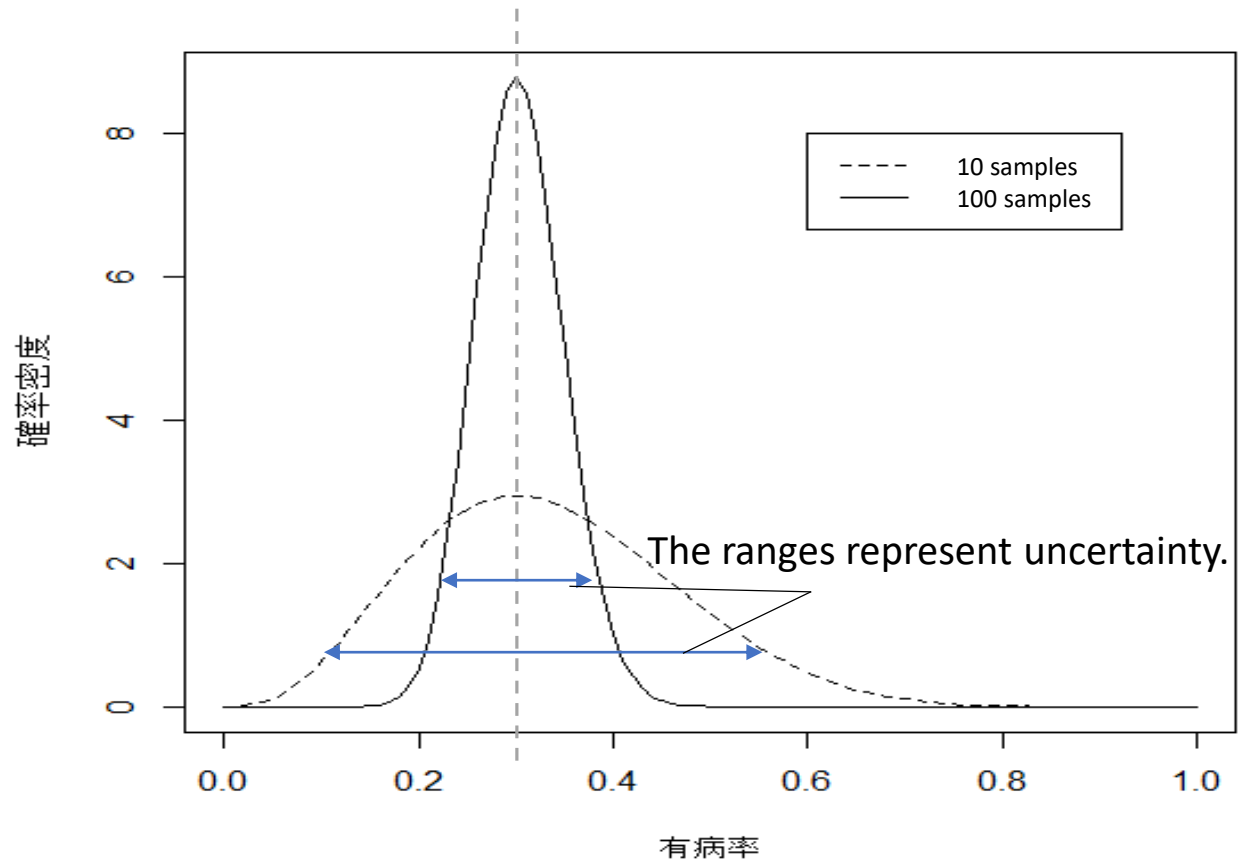


図 15-2 正規分布の平均と標準偏差の関係

Uncertainty in the estimation of the mean proportion

How confidence are you when you say '30% resistant'?



- Example: resistant rate of *E. coli* for colistin

- Out of 10 samples, 3 samples were resistant 95%CI: 10.9 – 61.0%
- Out of 100 samples, 30 sampled were resistant 95%CI: 21.9 – 39.6%
- Resistant rates are both 30%, then what is the difference?

*The exact value, $3 \div 10 = 0.3$ is called 'a point estimate'.

On the other hand, the range that a true mean can take under probability is called interval estimate.

Estimation of the confidence interval of a proportion

(A frequentist approach)

$$95\% \text{ confidence interval} = \hat{p} \pm 1.96 \times \sqrt{\underbrace{\hat{p}(1-\hat{p})}_{\text{Variability}} / \underbrace{m}_{\text{Uncertainty}}}$$

$\hat{p}$: proportion calculated from data m : sample size

- Example: 例 : 40 dogs were selected from a kennel and tested for antibodies to a certain disease. 23 tested positive. Find the 95% confidence interval for the antibody positivity rate in this kennel.

```
> 23/40
[1] 0.575
> 1.96*(0.575*(1-0.575)/40)^0.5
[1] 0.1531985
> 0.575-0.153
[1] 0.422
> 0.575+0.153
[1] 0.728
```

57.5% (95%CI: 42.2% - 72.8%)

```
> qbeta(0.025,23+1,40-23+1)
[1] 0.4210961
> qbeta(0.975,23+1,40-23+1)
[1] 0.7153129
```

(Bayesian approach based on beta distribution)

57.5% (95%CI: 42.1% - 71.5%)

Estimation of 95% confidence interval of the mean of a mother population using normally distributed sample data

$$95\% \text{ confidence interval} = \bar{x} \pm t_{0.05}(n-1) \times \frac{s}{\sqrt{n}}$$

Standard error

Uncertainty

Variability
Uncertainty

Degree of freedom

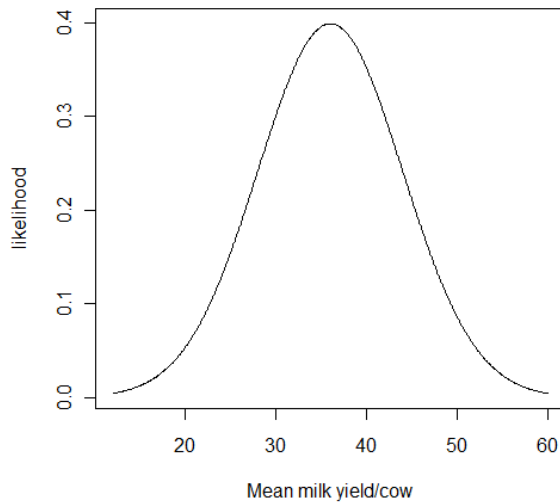
表 15-2 t 分布表

自由度	両側確率		自由度	両側確率		自由度	両側確率		自由度	両側確率	
	0.05	0.01		0.05	0.01		0.05	0.01		0.05	0.01
1	12.706	63.66	11	2.201	3.106	21	2.080	2.831	40	2.021	2.704
2	4.303	9.925	12	2.179	3.055	22	2.074	2.819	50	2.009	2.678
3	3.182	5.841	13	2.160	3.012	23	2.069	2.807	60	2.000	2.660
4	2.776	4.604	14	2.145	2.977	24	2.064	2.797	70	1.994	2.648
5	2.571	4.032	15	2.131	2.947	25	2.060	2.787	80	1.990	2.639
6	2.447	3.707	16	2.120	2.921	26	2.056	2.779	90	1.987	2.632
7	2.365	3.499	17	2.110	2.898	27	2.052	2.771	100	1.984	2.626
8	2.306	3.355	18	2.101	2.878	28	2.048	2.763	120	1.980	2.617
9	2.262	3.250	19	2.093	2.861	29	2.045	2.756	240	1.970	2.596
10	2.228	3.169	20	2.086	2.845	30	2.042	2.750	∞	1.960	2.576

Parametric and non-parametric

Parametric

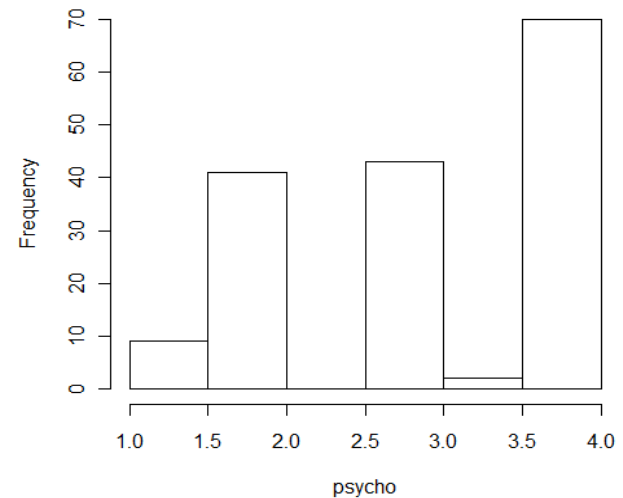
Parametric distribution is determined by parameters



Milk yield which follows normal distribution

Non-parametric

Statistics which do not use any mathematical assumption



Psychological stress in foot and mouth disease control (rank)

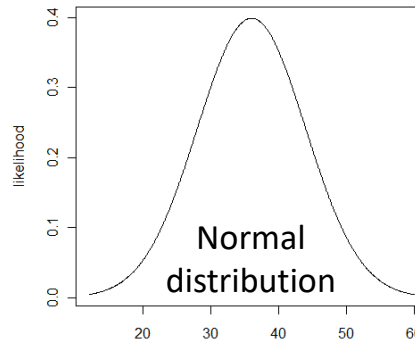
*Parameters

Normal distribution: Mean and standard deviation

Beta distribution: Trial and success

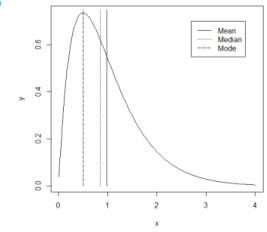
Relationships between main distributions

Fundamental of
all statistics



Random sampling the
data and take the mean
Repeating the process
(Bootstrap)

Any distribution



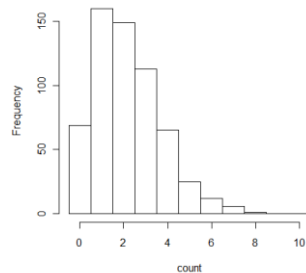
Central limit
theorem

$f(x) = \log x$
Log
transformation

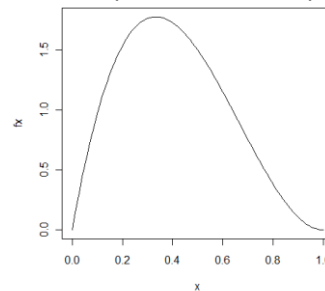
$f(x) = \log \frac{p}{1-p}$
Logit
transformation

$f(x) = \frac{1}{x}$
Reciprocal
transformation

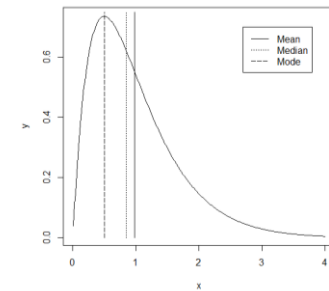
Counts (animal, human, cell)
Poisson distribution
(Poisson error)



Proportion (prevalence, disease/healthy)
Beta distribution/Binomial distribution
(Binomial error)

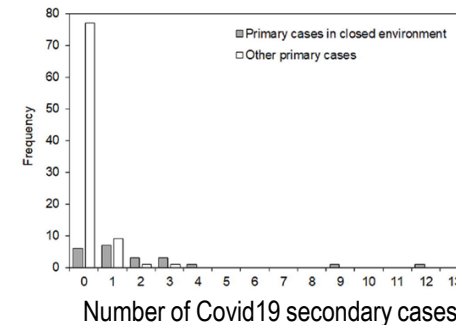
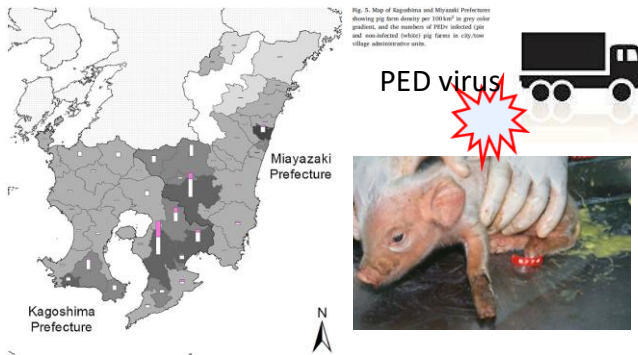
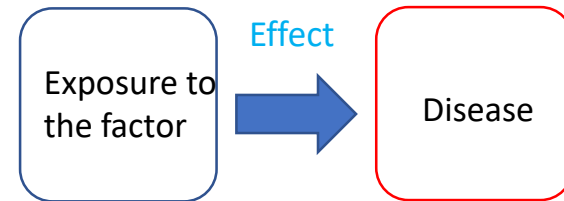
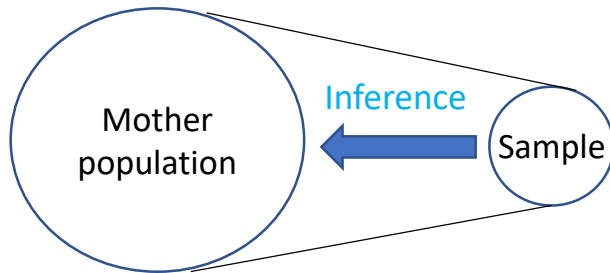


Time (time, liquid, weight)
Gamma distribution
(Gamma error)



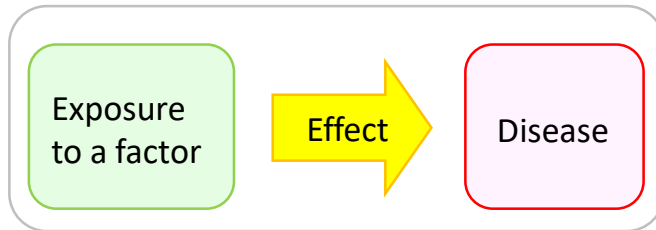
Hypothesis testing

- To probabilistically test the hypothesis that **the disease occurs due to the exposure to the factor** of interest in a population

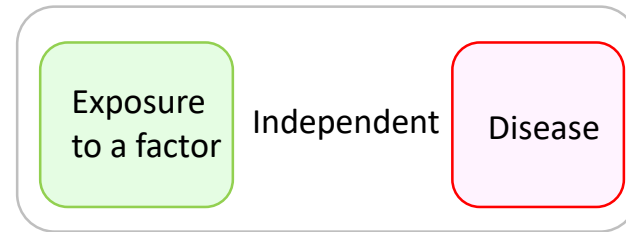


Process of hypothesis testing

Hypothesis



Null hypothesis



- Hypothesis
 - The proportion of multi-drug resistance *E. coli* is higher in small-scale farms than commercial large scale farms
- Develop null-hypothesis
 - The proportion of MDR *E. coli* is the same between small-scale and large-scale farms
 - (But actual calculation for p-value is the probability that large-scale farms have higher MDR rate)
- Prove that null-hypothesis is false
- Accept the hypothesis
- P-value is the probability of an event occurring under null-hypothesis

Process of hypothesis testing

- Set a hypothesis
- Set a null hypothesis (there is no effect of hypothesis)

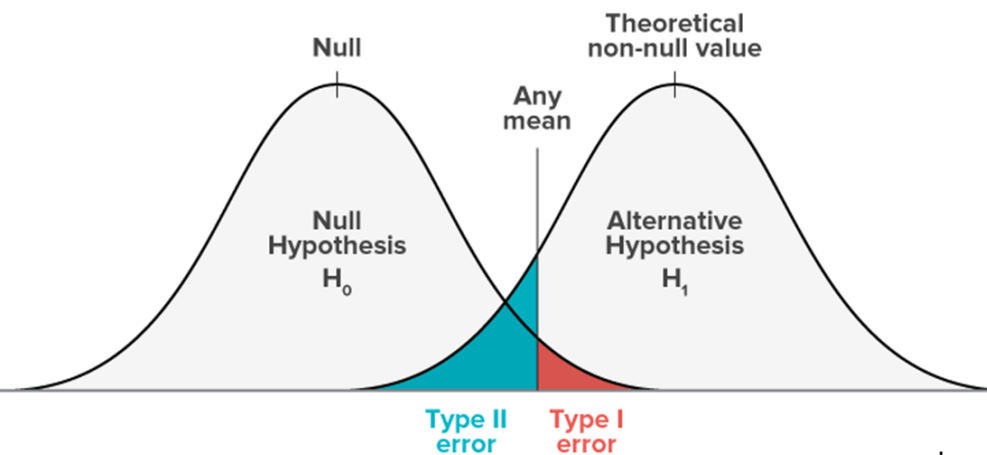
- Prove that null-hypothesis is wrong (reject)

- Hypothesis is correct

- Or, accept the null-hypothesis

- Hypothesis is wrong

- Test statistics $>$ threshold value
- At significant level 5%, $p < 0.05$

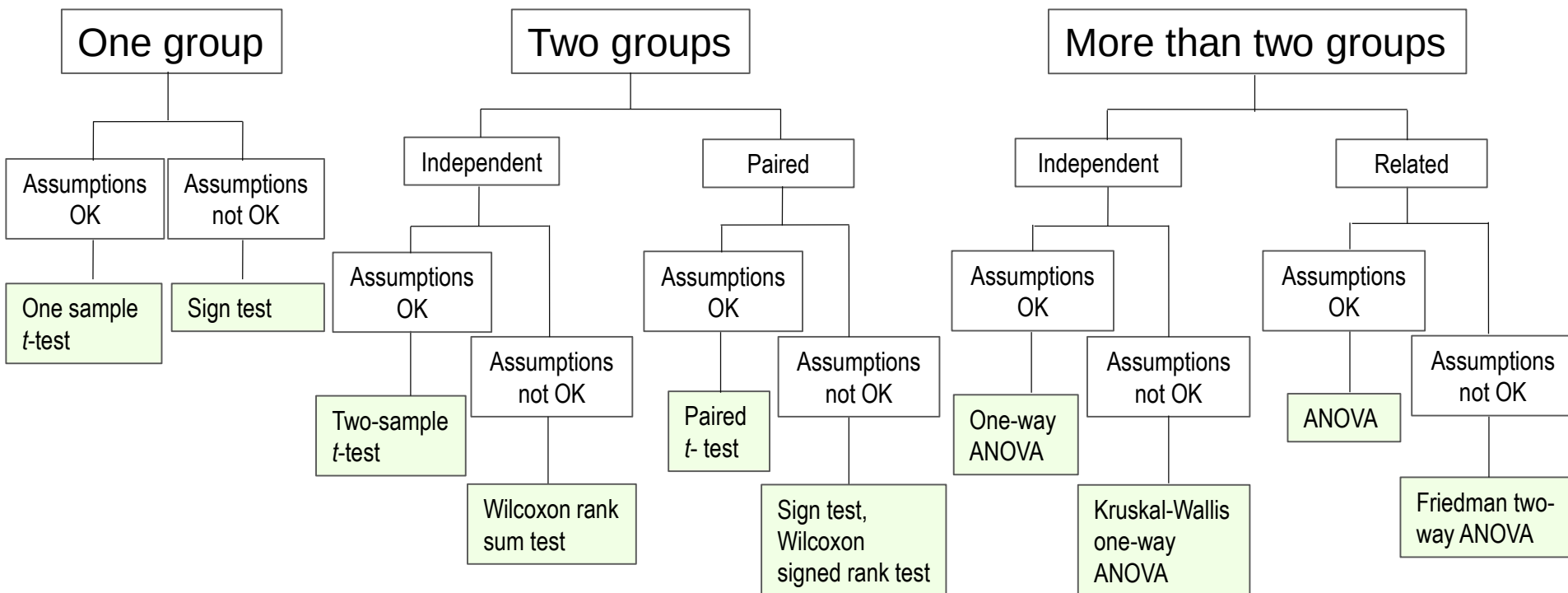


Hypothesis Null-hypothesis

		True status	
		Effect	No effect
Statistics	Effect (Reject null-hypothesis)	Correct estimate (1- β) Power	Type I error (α) p -value
	No effect (Accept null-hypothesis)	Type II error (β)	Correct estimate (1- α)

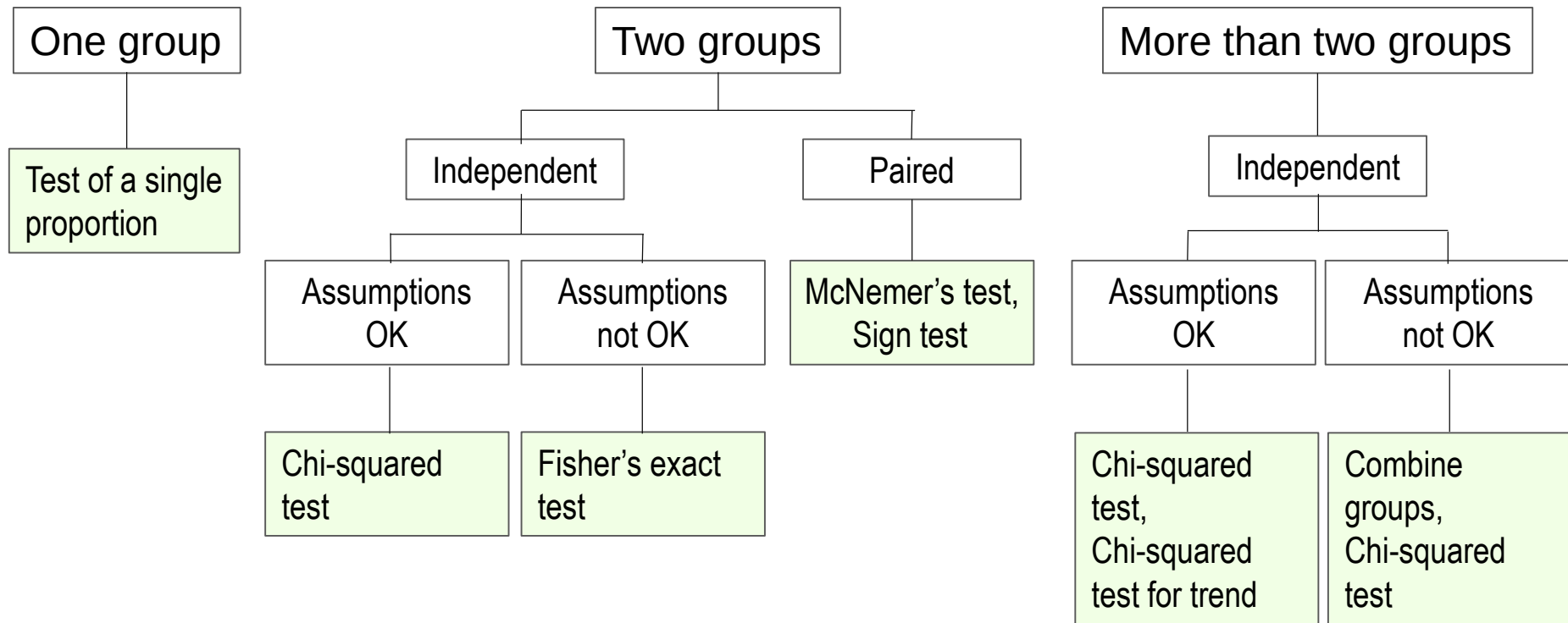
* p -value is a probability that null-hypothesis is observed when null-hypothesis is true

Flow chart for the comparison of groups in continuous/count/rank variables



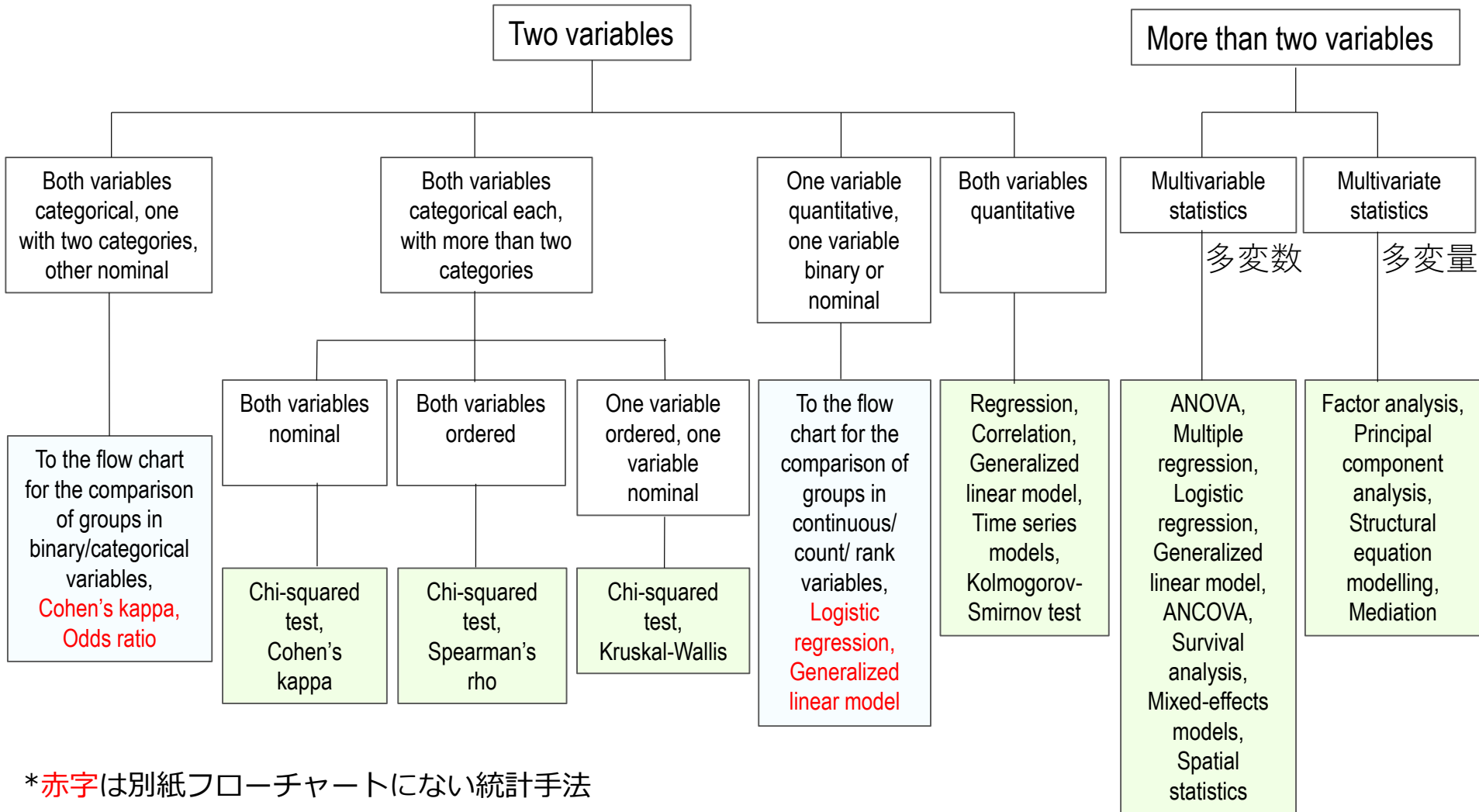
*Assumptions: data follow Normal distribution and variance is not significantly different when comparing more than or equal to two variables.

Flow chart for the comparison of groups in binary/categorical variables



*Assumptions: at least one cell include expected frequency smaller than five.

Flow chart for the analyses of the relationships between variables



Any questions?



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World Organisation
for Animal Health
Founded as OIE