

Predictive Microbiology

A tool to support food safety decisions

Models of microbial inactivation

- application in foods

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7th December 2007

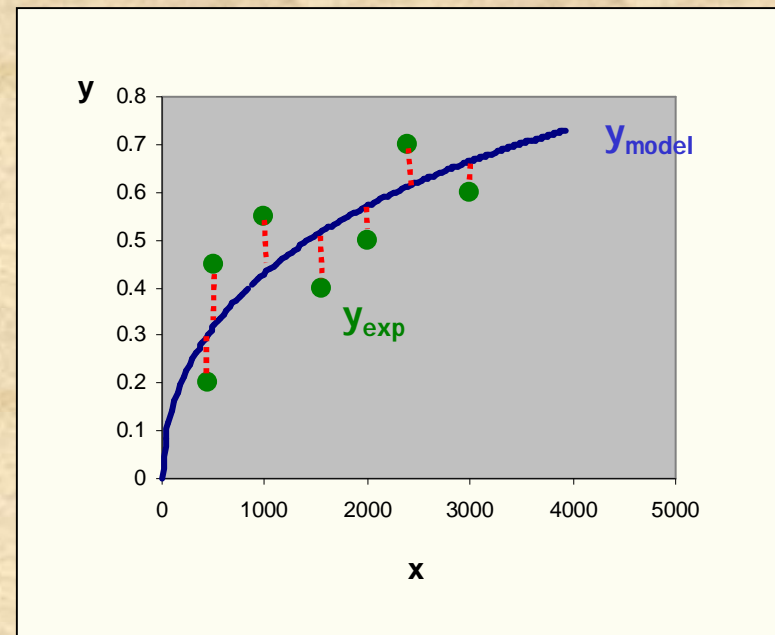
Mathematical modelling

some concepts ...

$$y = f(x, q) + e$$

Parameters estimation

minimization of the residuals
between **experimental** values
and the ones predicted by the **model**



Precise ?

q^*

Accurate ?



Mathematical modelling

objective

precise and accurate description of data

model adequacy

quality of the parameters



Mathematical modelling

mechanistic models

- ◆ fundamental description of the processes involved
- ◆ more complex

empirical models

- ◆ *black boxe*
- ◆ more simple (or not!)
- ◆ practical application



advantages and **disadvantages** should be considered
decision depending on the **final goal**

Mathematical modelling

mathematical
complexity



model adequacy

quality

model



parameters

advantages

- **knowledge of the process**
- **process effect in the product**
- **control of the variables involved**

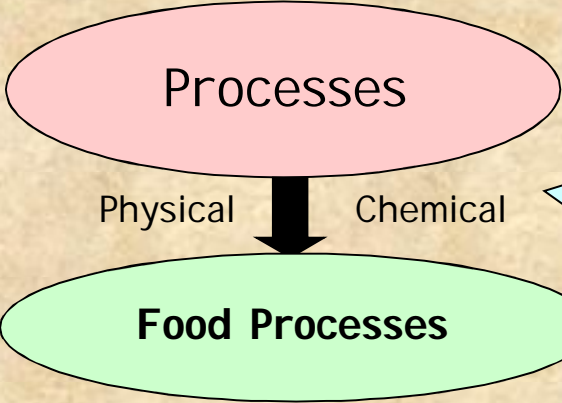
Mathematical modelling

Transport Phenomena

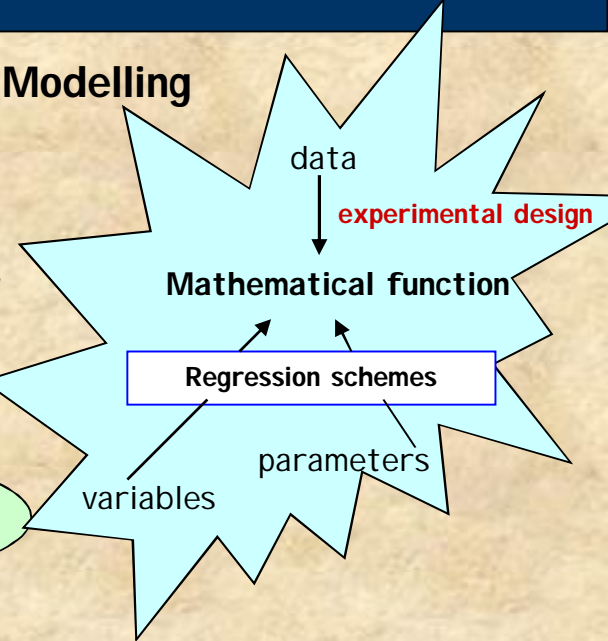
- heat
- mass
- *momentum*

Reaction kinetics

Properties



Modelling



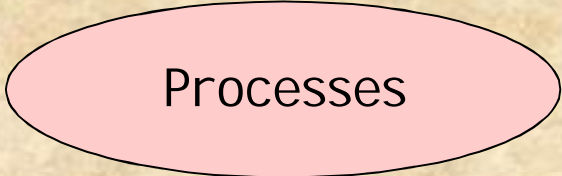
Mathematical modelling

Transport Phenomena

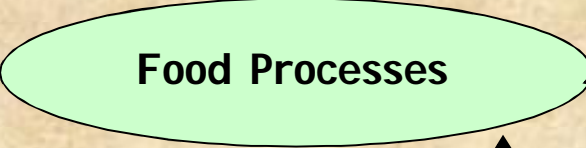
- heat
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Reaction kinetics

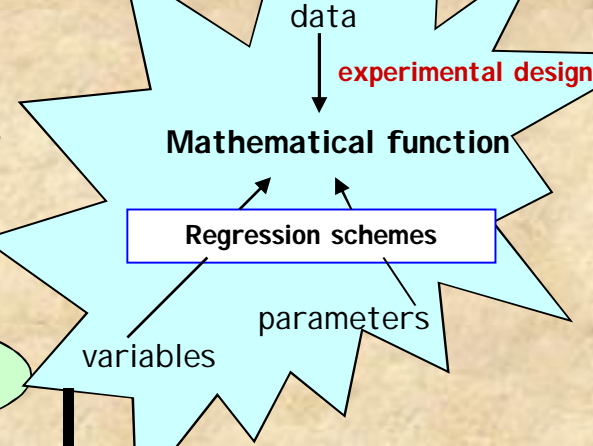
Properties



Physical Chemical



Modelling



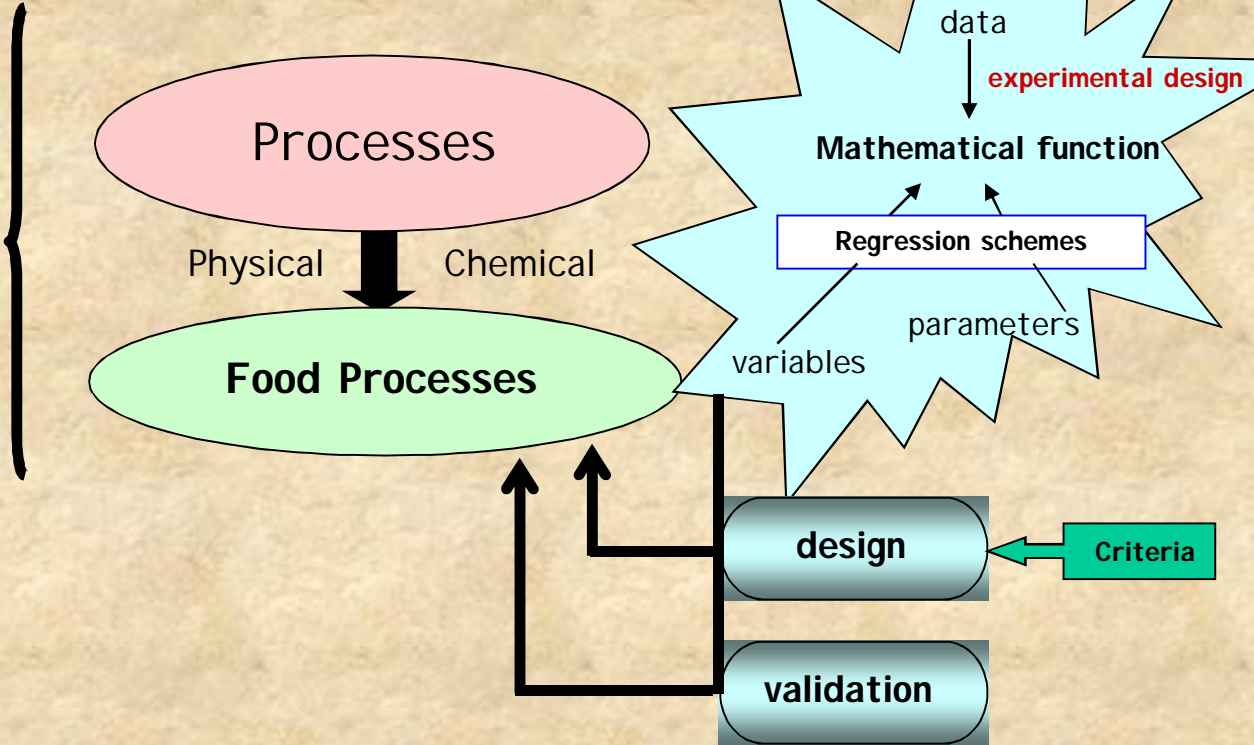
Mathematical modelling

Transport Phenomena

- heat
- mass
- *momentum*

Reaction kinetics

Properties



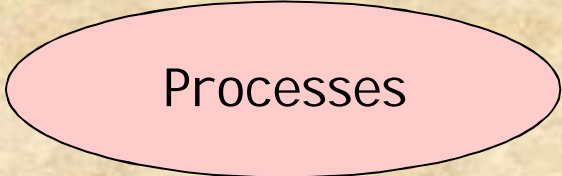
Mathematical modelling

Transport Phenomena

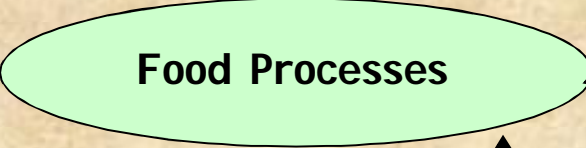
- heat
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Reaction kinetics

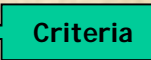
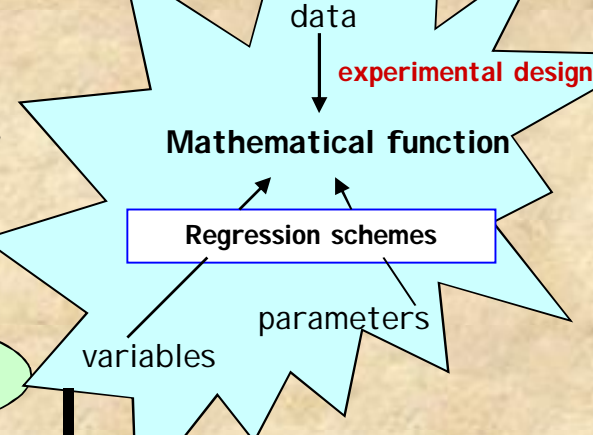
Properties



Physical Chemical



Modelling



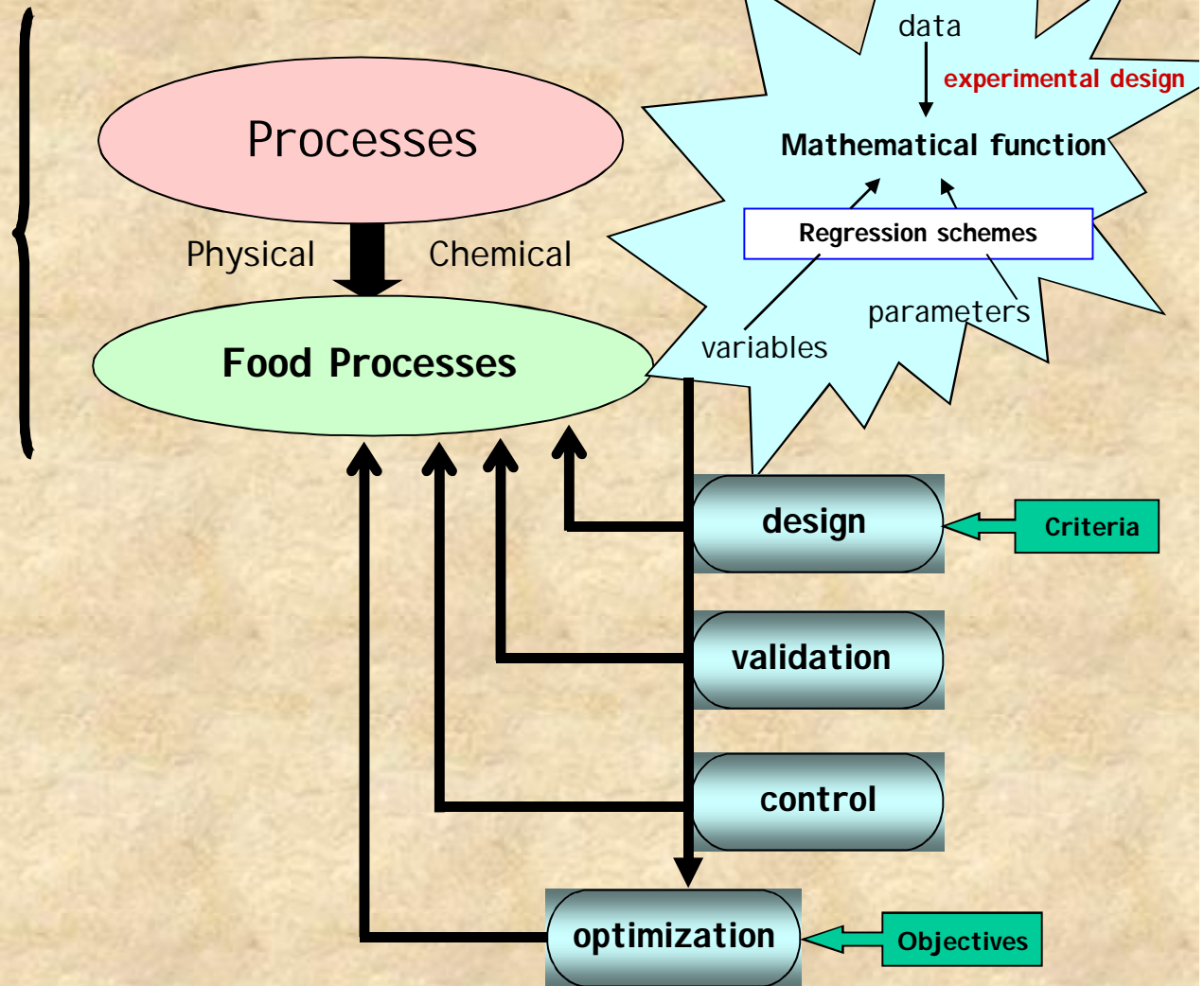
Mathematical modelling

Transport Phenomena

- heat
- mass
- *momentum*

Reaction kinetics

Properties



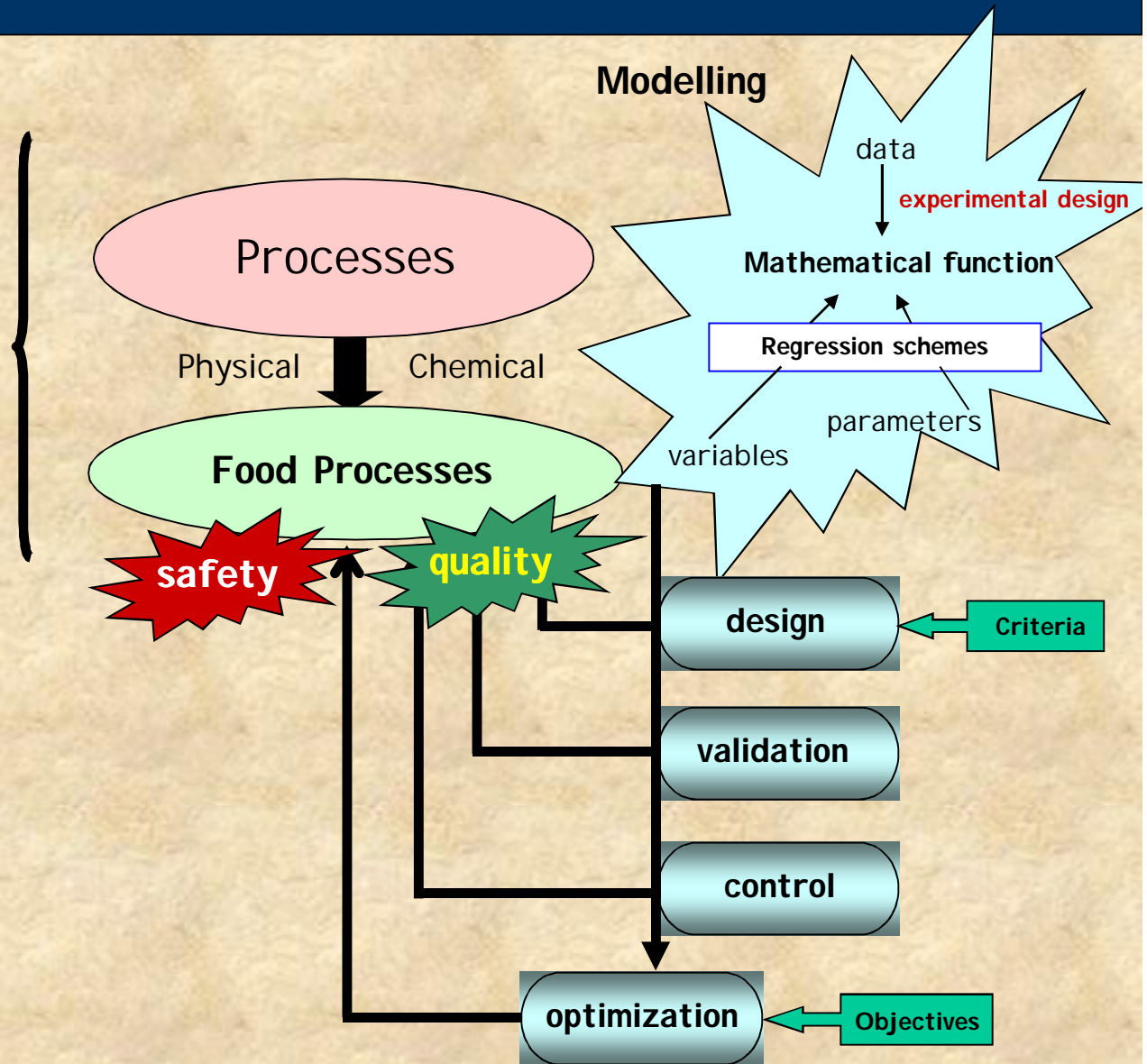
Mathematical modelling

Transport Phenomena

- heat
- mass
- *momentum*

Reaction kinetics

Properties



Mathematical modelling



safety

Mathematical modelling

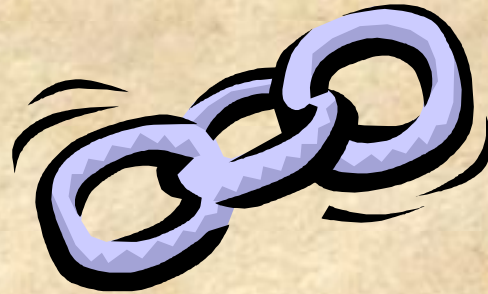


**predictive
microbiology**

Mathematical modelling

**predictive
microbiology**

microbiology



statistics

mathematics

aplication

- prediction / simulation
- development of efficient inactivation processes



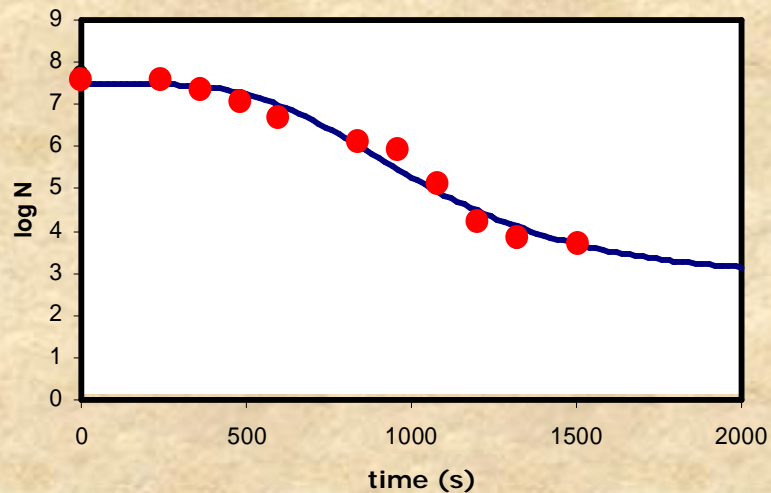
contribution to **safety**

Predictive microbiology

inactivation

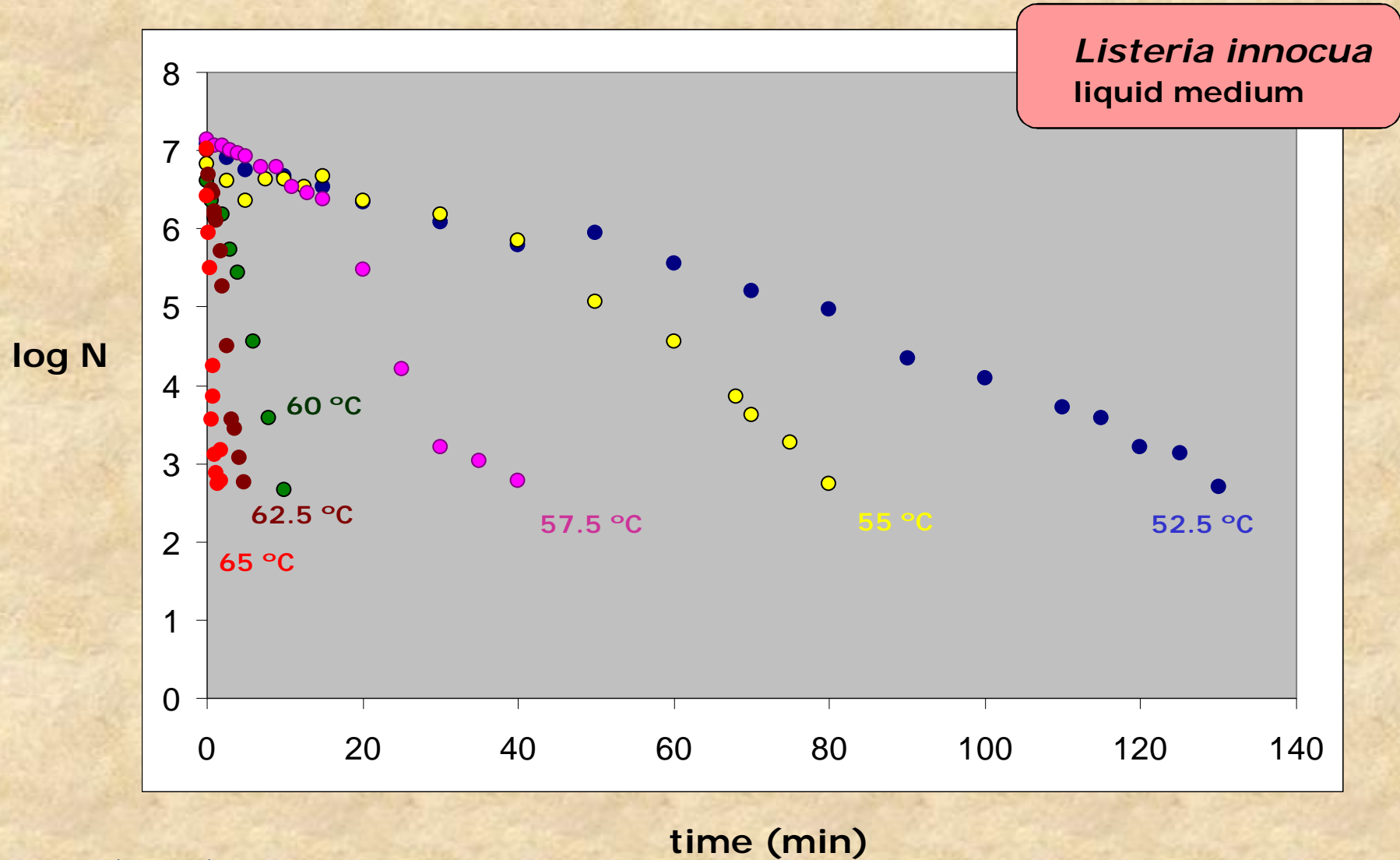


Sigmoidal behaviour



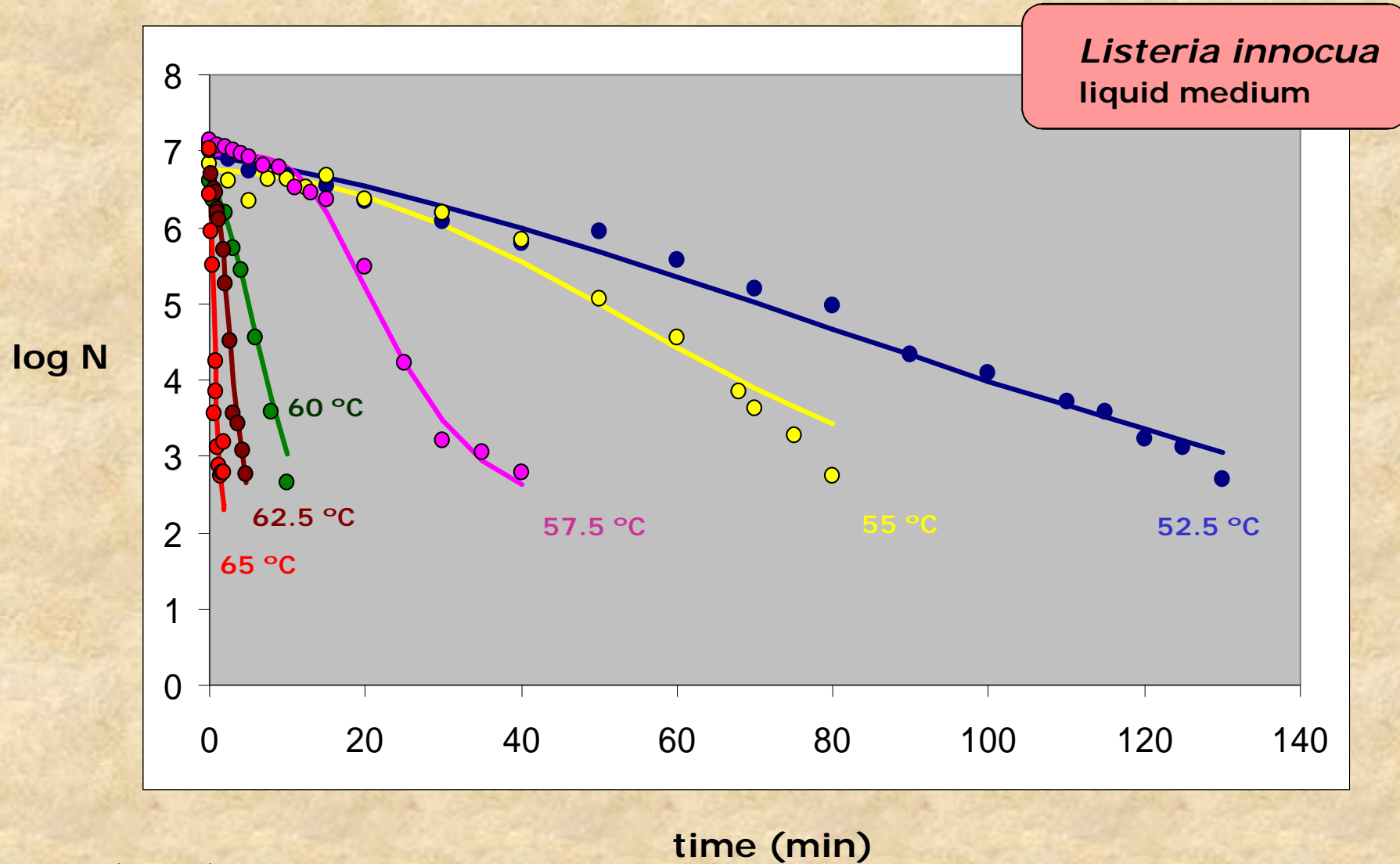
Reflects the presence of microbial sub-populations
more **temperature resistant**
(or other environmental **stressing factor**)

Example



Miller (2004)

Example



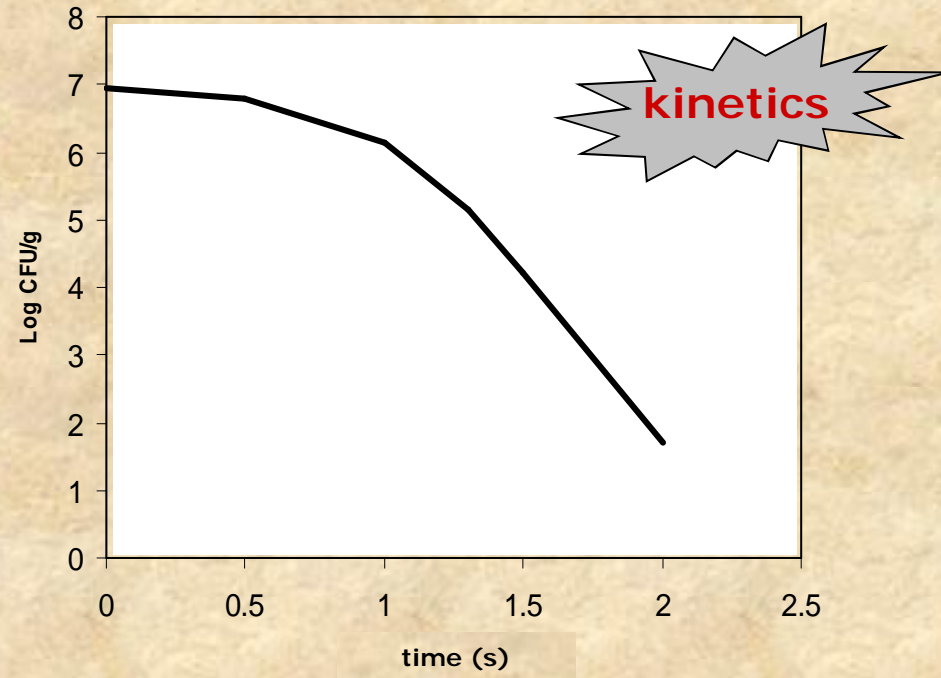
Miller (2004)

Mathematical models

❖ primary

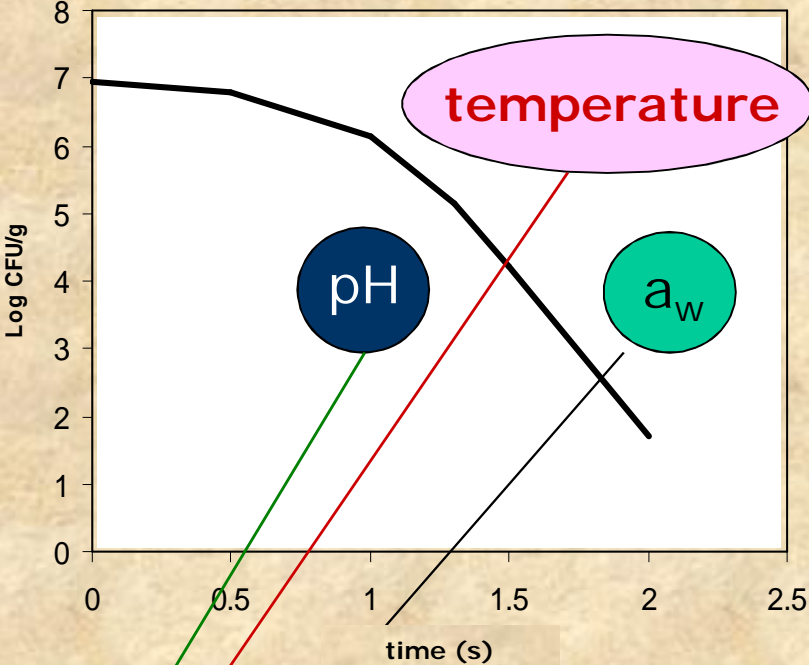


parameters



Mathematical models

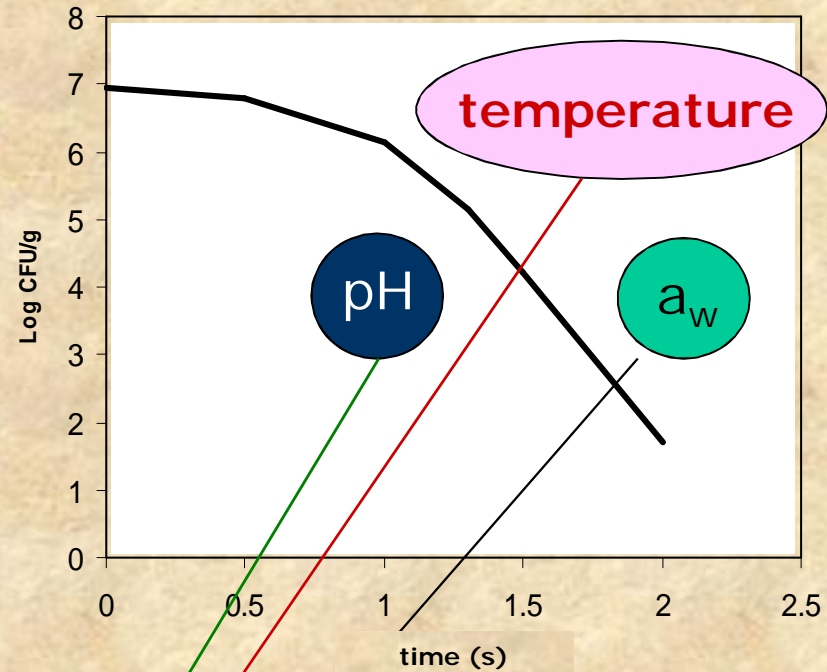
❖ primary



❖ secondary parameters

Mathematical models

❖ primary

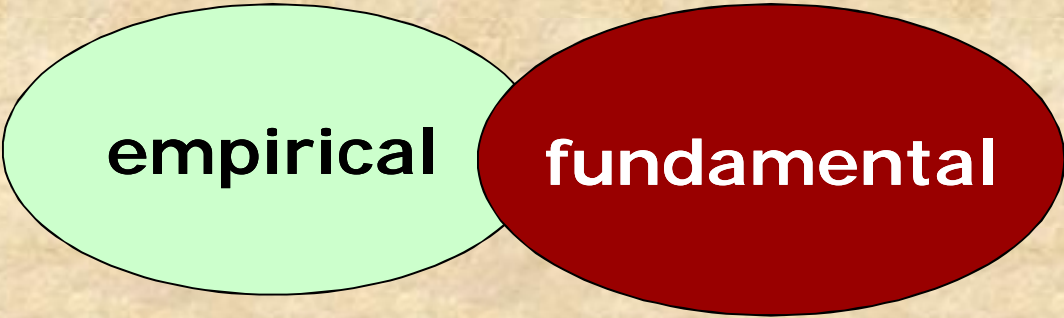
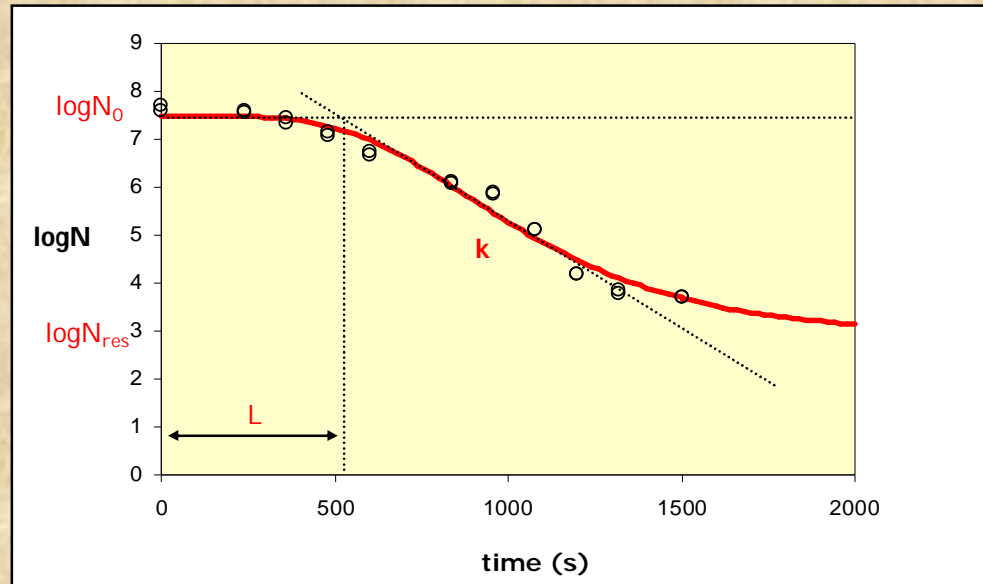


❖ secondary
parameters

❖ tertiary - all models integration - software

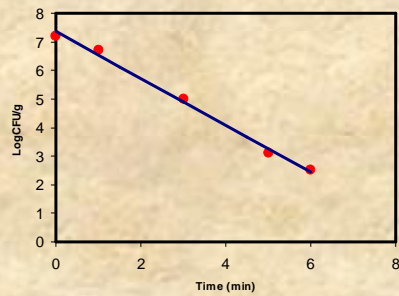
Models for inactivation

❖ primary



Models for inactivation

❖ primary



$$N = N_0 \exp(-kt)$$



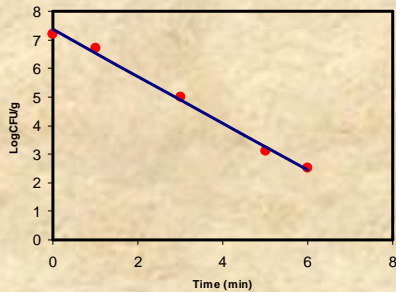
$$\log N = \log N_0 - \frac{t}{D}$$

1st order

D – decimal reduction time

Models for inactivation

❖ primary



$$N = N_0 \exp(-kt)$$



$$\log N = \log N_0 - \frac{t}{D}$$

1st order

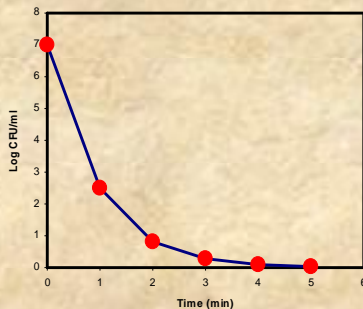
D – decimal reduction time

$$\frac{N}{N_0} = F_1 \exp(-k_1 t) + (1 - F_1) \exp(-k_2 t)$$

Cerf
(1977)

biphasic

F_1 – fraction of inactivated microorganisms
 k_1 e k_2 – kinetic constants

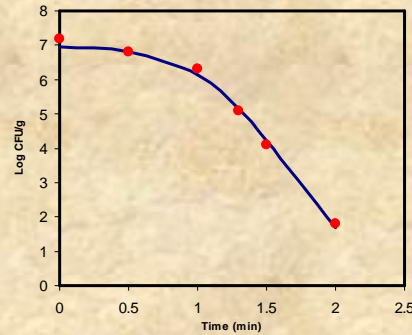


$$\log \frac{N}{N_0} = \log \left(\frac{2F_1}{1 + \exp(k_1 t)} + \frac{2(1 - F_1)}{1 + \exp(k_2 t)} \right)$$

Kamau et al.
(1990)

Models for inactivation

❖ primary



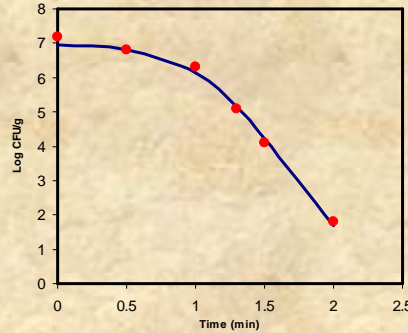
Whiting & Buchanan
(1992)

$$\log \frac{N}{N_0} = \log \left(\frac{F_1(1 + \exp(-k_1L))}{1 + \exp(k_1(t - L))} + \frac{(1 - F_1)(1 + \exp(-k_2L))}{1 + \exp(k_2(t - L))} \right)$$

L – lag or shoulder

Models for inactivation

❖ primary



Whiting & Buchanan
(1992)

$$\log \frac{N}{N_0} = \log \left(\frac{F_1(1 + \exp(-k_1L))}{1 + \exp(k_1(t - L))} + \frac{(1 - F_1)(1 + \exp(-k_2L))}{1 + \exp(k_2(t - L))} \right)$$

L – lag or shoulder

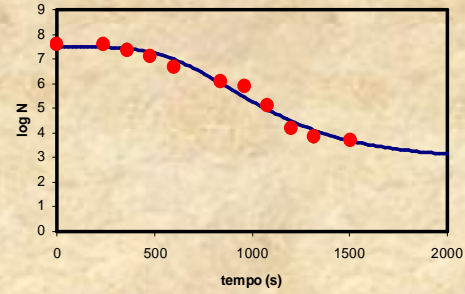
Cole et al.
(1993)

$$\log N = \alpha + \frac{w - \alpha}{1 + \exp\left(\frac{4\sigma(\lambda - \log t)}{w - \sigma}\right)}$$

Distribution of
microbial population
heat sensitiveness

Models for inactivation

❖ primary



Baranyi et al.
(1993)

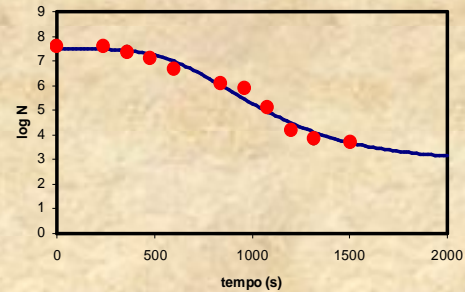
$$\frac{dN}{dt} = -k \alpha(t) \beta(t) N$$
$$N(t = 0) = N_0$$

function 'tail'

function 'lag'

Models for inactivation

❖ primary



Baranyi et al.
(1993)

$$\frac{dN}{dt} = -k \alpha(t) \beta(t) N$$

$$N(t = 0) = N_0$$

function 'tail'

function 'lag'

Geeraerd et al.
(2000)

$$\frac{dN}{dt} = -k_{\max} k_Q(Q) N$$

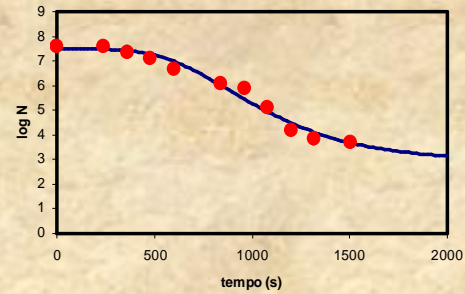
$$\frac{dQ}{dt} = -k_{\max} Q$$

$$\log\left(\frac{N}{N_0}\right) = \log(\exp(-k_{\max} t)) \frac{1 + Q(0)}{1 + Q(0) \exp(-k_{\max} t)}$$

Q – variable related to the physiological state of microorganisms

Models for inactivation

❖ primary



Gompertz

Bhaduri et al (1991)
Linton et al. (1995, 1996)
Xiong et al. (1999)



Listeria monocytogenes

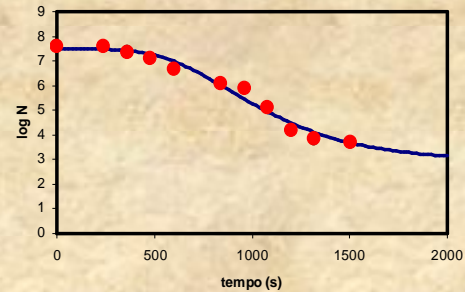
$$\log N = \log N_0 + \log \left(\frac{N_{res}}{N_0} \right) \exp \left(- \exp \left(- \frac{k e}{\log \left(\frac{N_{res}}{N_0} \right)} (L - t) + 1 \right) \right)$$



Reparameterization for inactivation based on Zwietering et al. (1990)

Models for inactivation

❖ primary



Gompertz

Bhaduri et al (1991)
Linton et al. (1995, 1996)
Xiong et al. (1999)



Listeria monocytogenes

$$\log N = \log N_0 + \log \left(\frac{N_{res}}{N_0} \right) \exp \left(- \exp \left(- \frac{k e}{\log \left(\frac{N_{res}}{N_0} \right)} (L - t) + 1 \right) \right)$$



Reparameterization for inactivation based on Zwietering et al. (1990)

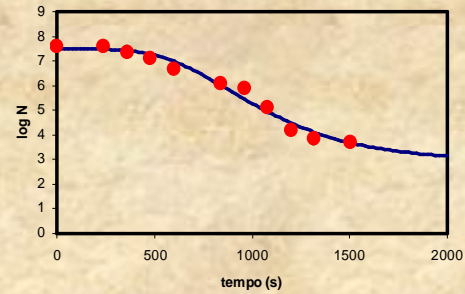
Logistic

$$\log N = \frac{c}{1 + \exp(k(t - L))}$$

c – constant

Models for inactivation

❖ Gompertz



elected in our research

$$\log N = \log N_0 + \log \left(\frac{N_{\text{res}}}{N_0} \right) \exp \left(- \exp \left(- \frac{k e}{\log \left(\frac{N_{\text{res}}}{N_0} \right)} (L - t) + 1 \right) \right)$$

or

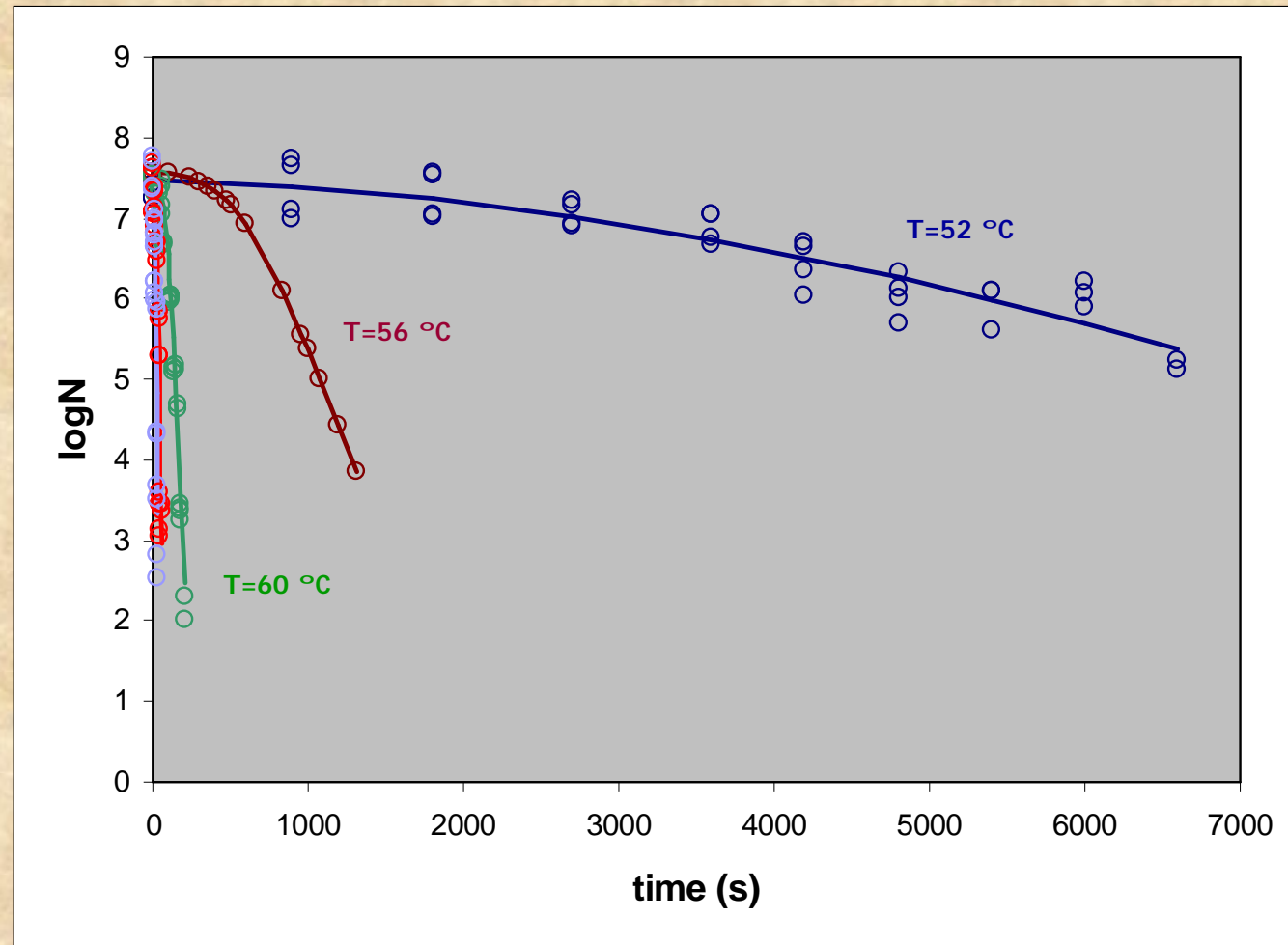
$$\log \frac{N}{N_0} = \log \left(\frac{N_{\text{res}}}{N_0} \right) \exp \left(- \exp \left(- \frac{k e}{\log \left(\frac{N_{\text{res}}}{N_0} \right)} (L - t) + 1 \right) \right)$$

Examples

Data of *L. monocytogenes* Scott A at 52,56,60,64,68°C
(24 hours incubation at 5°C in half cream)

Casadei et al. (1998)

Gompertz



Gil (2002)

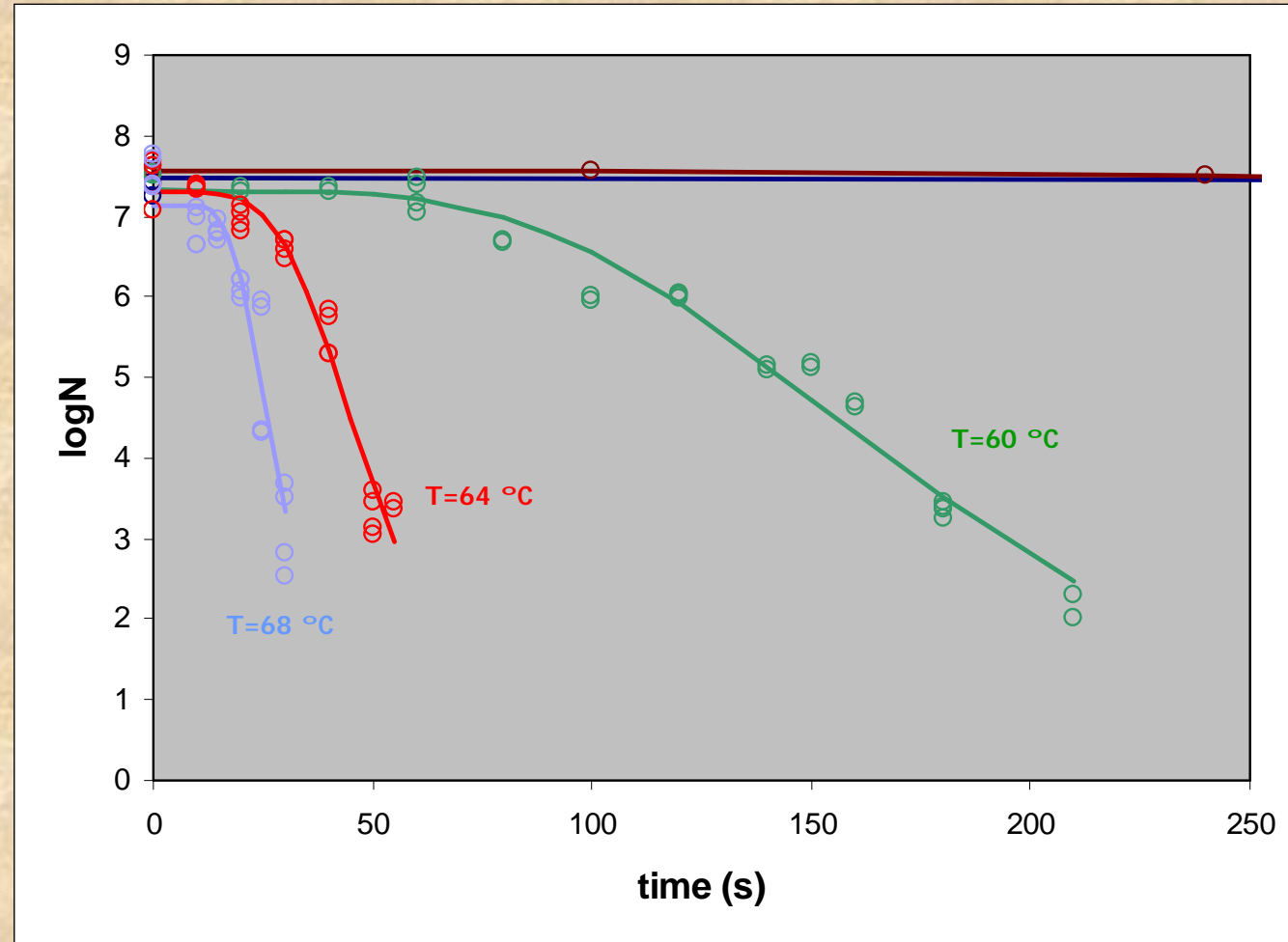
Statistica 6.0

Examples

Data of *L.monocytogenes* Scott A at 52,56,60,64,68°C
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Gompertz

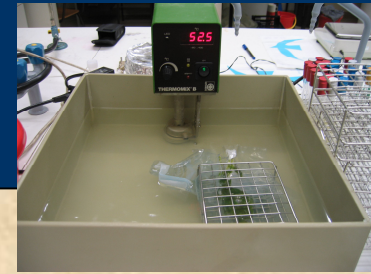


Gil (2002)

Statistica 6.0

Examples

Data of *L. innocua* at 52.5 and 60°C
Parsley (*Petroselinum crispum*) artificially contaminated



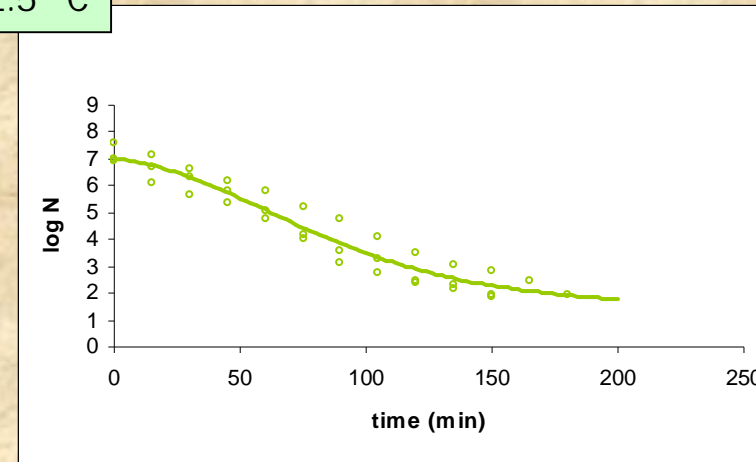
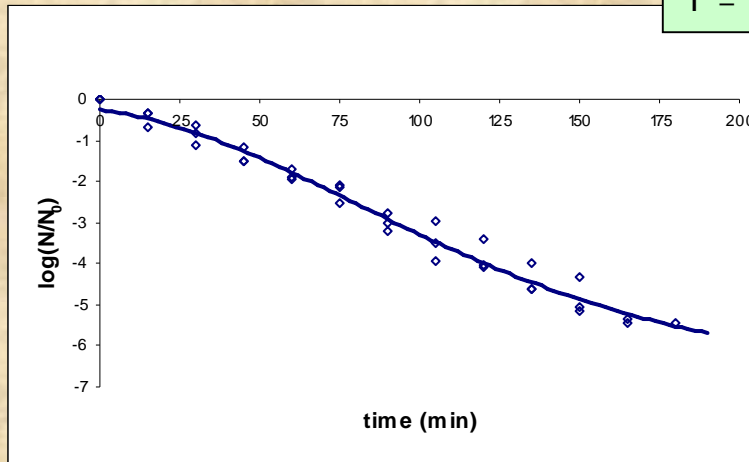
Gompertz

$$\log \frac{N}{N_0}$$

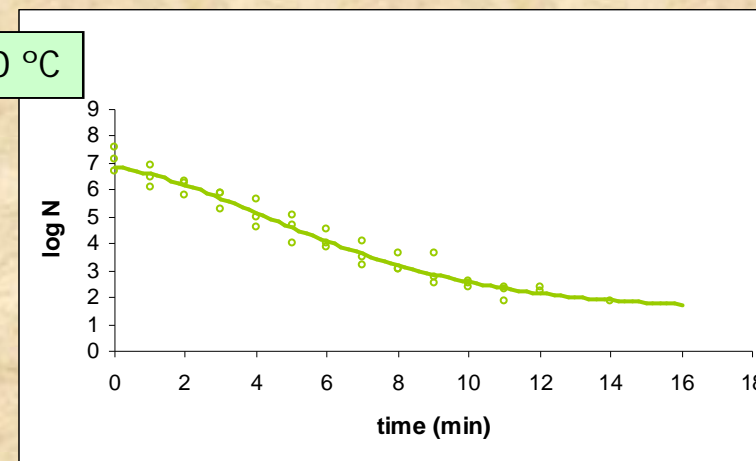
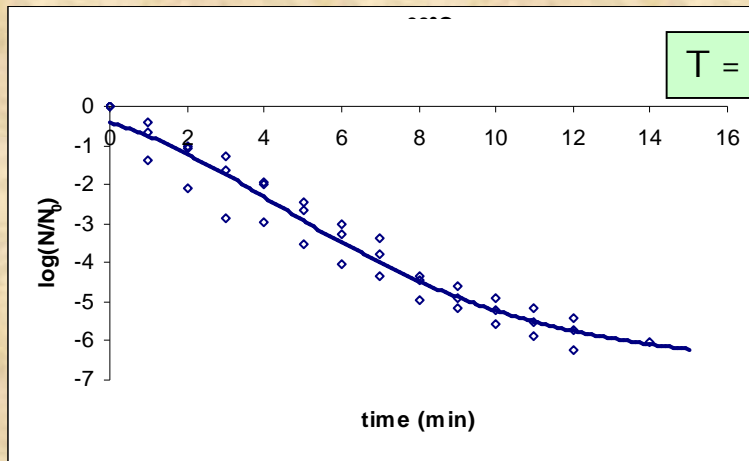
log N

Miller (2006)

T = 52.5 °C



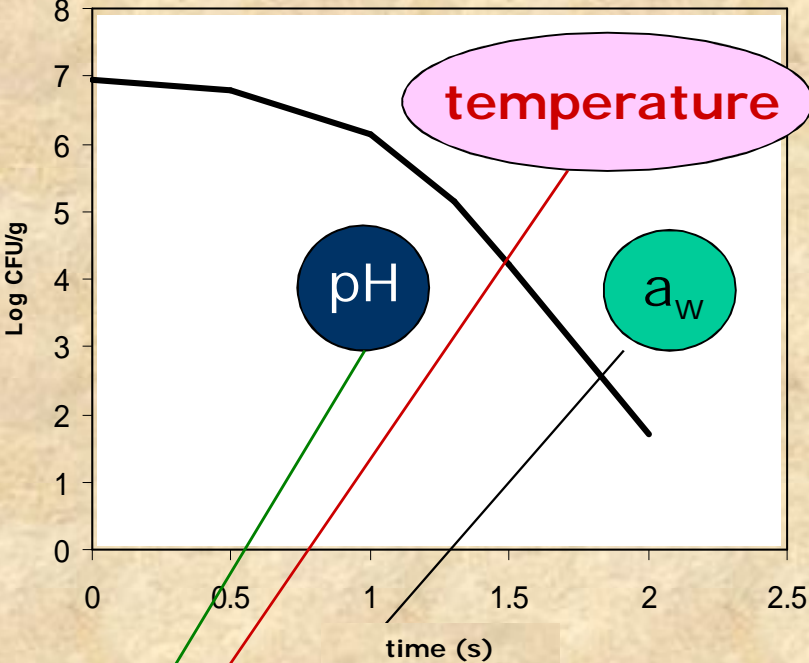
T = 60 °C



Statistica 6.0

Mathematical models

❖ primary



❖ secondary parameters

Mathematical models

❖ secondary

Arrhenius

$$k = k_0 \exp\left(-\frac{E_a}{RT}\right) \rightarrow \ln k = \ln k_0 - \frac{E_a}{RT}$$

$$k = k_{\text{ref}} \exp\left(-\frac{E_a}{R} \left(\frac{1}{T} - \frac{1}{T_{\text{ref}}}\right)\right)$$

Davey / Arrhenius modified

$$\ln k = C_0 + \frac{C_1}{T} + \frac{C_2}{T^2} + C_3 a_w + C_4 a_w^2$$

“Square-root type models”

Ratkowsky *et al.* (1982)

$$\sqrt{k} = b(T - T_{\text{min}})$$

McMeekin *et al.* (1987)

$$\sqrt{k} = b(T - T_{\text{min}}) \sqrt{(a_w - a_{w_{\text{min}}})}$$

Adams *et al.* (1991)

$$\sqrt{k} = b(T - T_{\text{min}}) \sqrt{(\text{pH} - \text{pH}_{\text{min}})}$$

McMeekin *et al.* (1992)

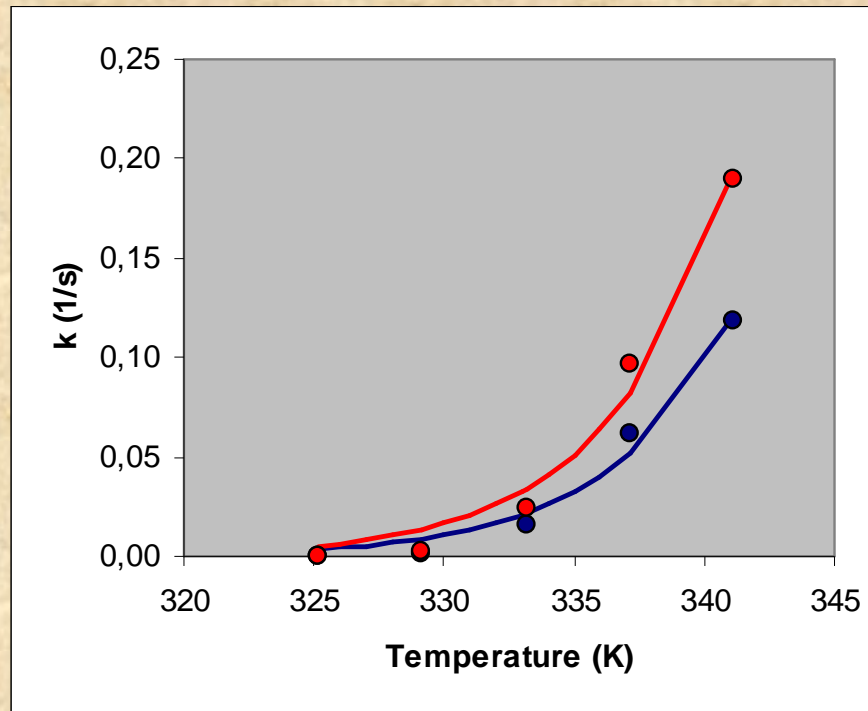
$$\sqrt{k} = b(T - T_{\text{min}}) \sqrt{(a_w - a_{w_{\text{min}}})} \sqrt{(\text{pH} - \text{pH}_{\text{min}})}$$

min – minimal value for growth

Examples

Data of *L.monocytogenes* Scott A
(24 hours incubation at 5°C in half cream)

Arrhenius



$k = f(T)$

Gompertz

$$k = 0.0216 \exp(-203.3/R^*(1/T - 1/333.15))$$

DEa=28.85 kJ/mol

DK_{ref}=4.58x10⁻³ s⁻¹

Logistic

$$k = 0.0337 \exp(-206.6/R^*(1/T - 1/333.15))$$

DEa=27.56 kJ/mol

DK_{ref}=7.31x10⁻³ s⁻¹

Gil (2002)

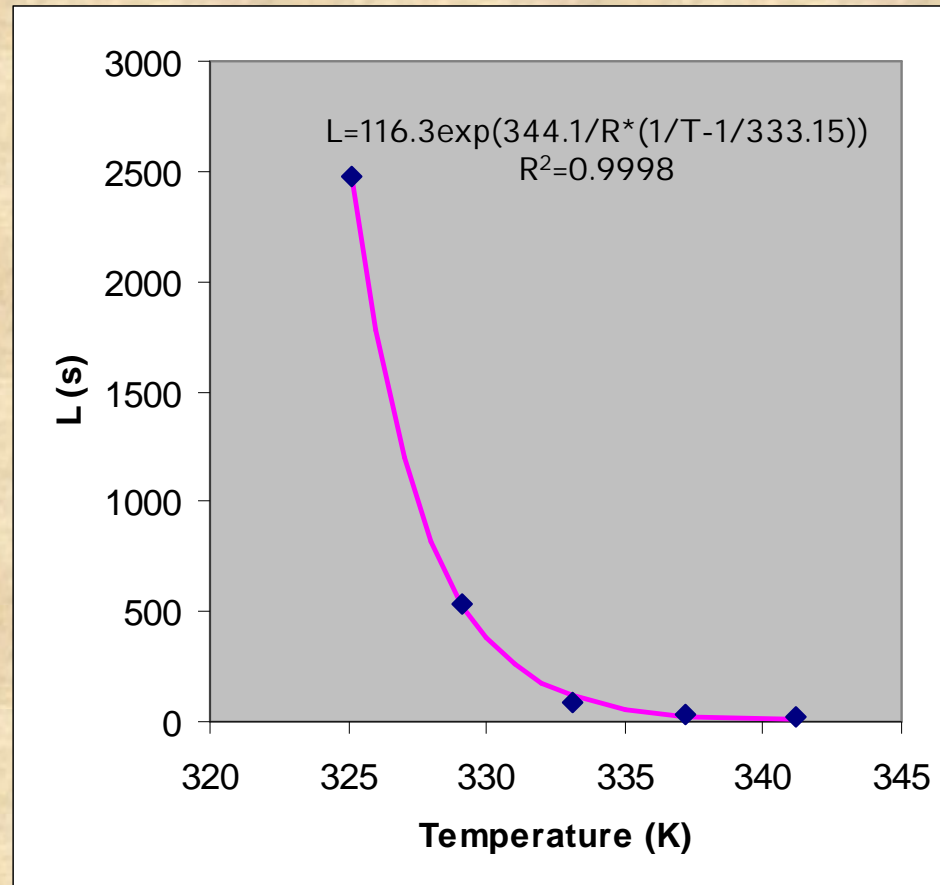
Statistica 6.0

Examples

Data of *L.monocytogenes* Scott A
(24 hours incubation at 5°C in half cream)

Gompertz

lag = f(T)



DEa=7.485 kJ/mol

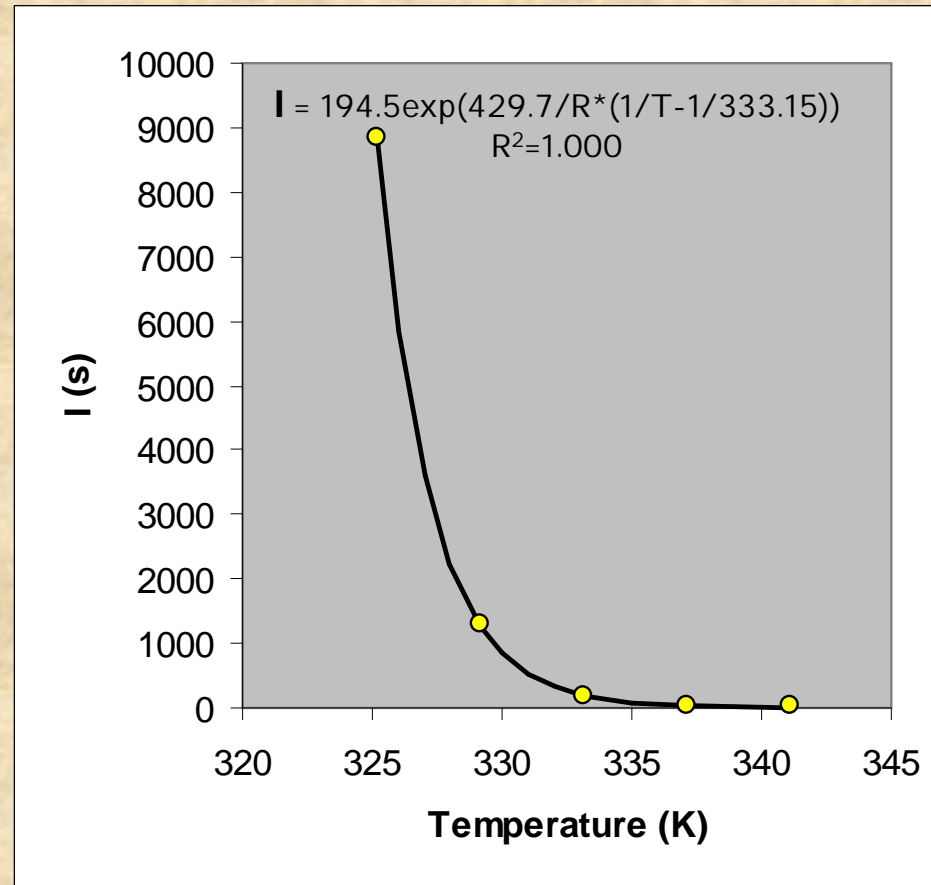
DL_{ref}=7.595 s⁻¹

Examples

Data of *L.monocytogenes* Scott A
(24 hours incubation at 5°C in half cream)

Logistic

lag = f(T)



$DE_a = 3.591$ kJ/mol

$DI_{ref} = 6.154$ s⁻¹

Gil (2002)

Statistica 6.0

Mathematical models

time-varying conditions

temperature

pH

a_w



More complexity !!



$$\frac{d(\log N)}{d(\text{tempo})}$$

Mathematical models

Gompertz

time-varying temperature conditions

$$\downarrow \frac{d(\log N)}{d(\text{tempo})}$$

$$\log N = \log N_0 + \int_0^t \left[k \exp(1) \exp \left(- \frac{k \exp(1)}{\log \left(\frac{N_{\text{res}}}{N_0} \right) (L - t') + 1} \right) \exp \left(- \exp \left(- \frac{k \exp(1)}{\log \left(\frac{N_{\text{res}}}{N_0} \right) (L - t') + 1} \right) \right) \right] dt'$$

$$k = k_{\text{ref}} \exp \left(- \frac{E_a}{R} \left(\frac{1}{T} - \frac{1}{T_{\text{ref}}} \right) \right)$$

$$L = a \exp \left(b \left(\frac{1}{T} - \frac{1}{T_{\text{ref}}} \right) \right)$$

Mathematical models

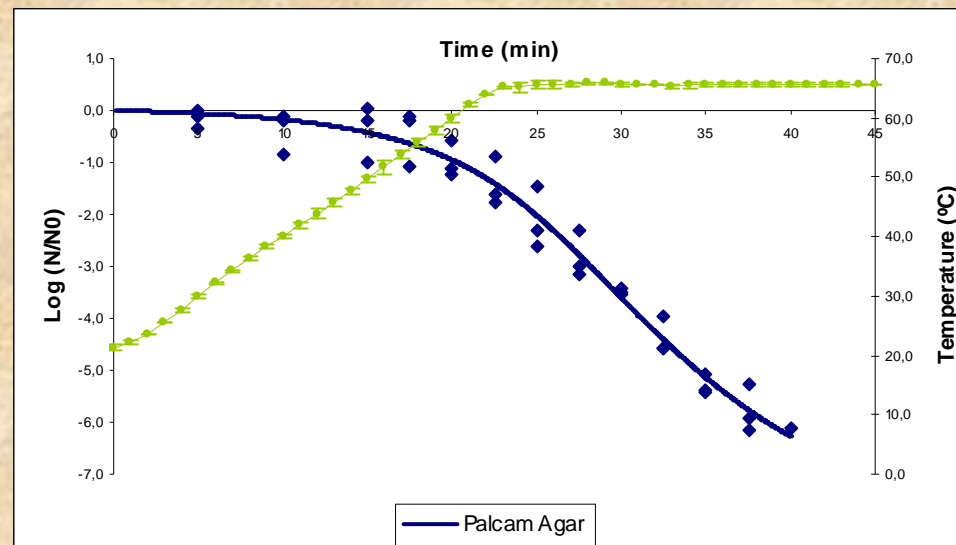
Parsley (*Petroselinum crispum*) artificially contaminated with *L. innocua*

Gompertz



Miller (2006)

time-varying temperature conditions



temperature increase rate ~ 2 °Cmin⁻¹

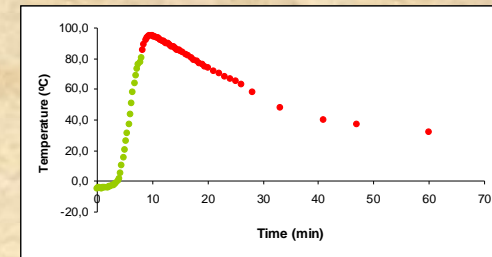
Mathematical models

Meat pockets artificially contaminated with *L. innocua*



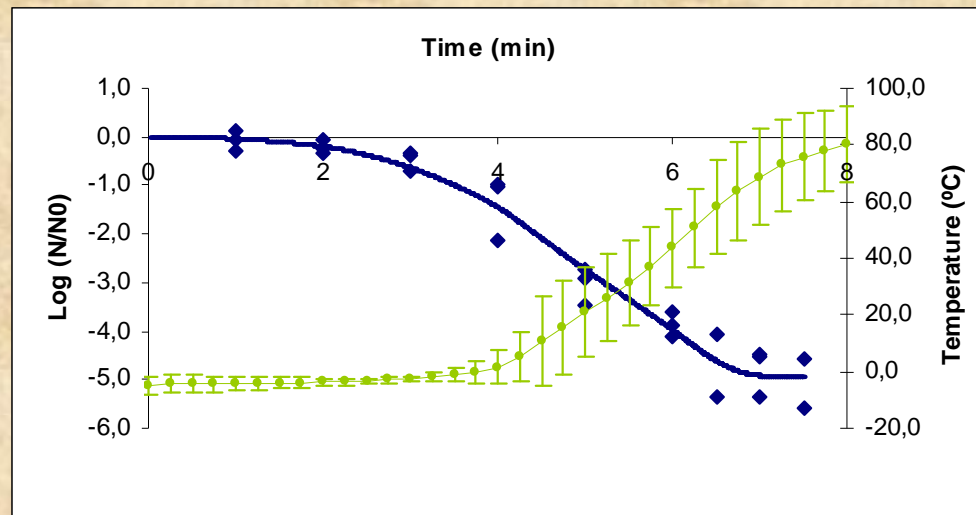
Gompertz

frying process



Miller (2006)

time-varying temperature conditions



maximum temperature increase rate ~ 20 °Cmin⁻¹

Models for inactivation

❖ tertiary

softwares

Microbial growth

Shelf life prediction

Microbial inactivation

lacunes

Predictive microbiology

Drawbacks

- microbial interaction
- natural strains diversity
- complexity of food structure
- food/microorganism
- modelling 'lag'
- modelling 'tail'
- predictions in real time-varying environmental conditions

Participation of our research team in the project ...

2001-2004

BUGDEATH

www.frperc.bris.ac.uk/bugdeath.htm

Predictive
microbiology

Surface
pasteurization of
foods

important boundary in food contamination

"BUGDEATH" (QLRT-2001-01415)



Micrograph of a Salmonella bacteria

Predicting the reduction in microbes on the surface of foods during pasteurisation.

- [Tell me more about the Bugdeath project.](#)
- [What are the objectives of the Bugdeath project?](#)
- [Who are the project partners?](#)
- [Meetings](#)
- [Industrial Advisory Group \(IAG\)](#)
- [Partner area of web site \(specifically for project partners - password needed to enter\)](#)

Bugdeath

BUGDEATH is a research project funded by the European Commission to produce accurate predictive models of the reductions in microbial numbers that can be achieved on the surface of foods during surface pasteurisation processes.

Food poisoning is increasing throughout the European Union (EU). Over 60% of outbreaks are associated with meat, fresh fruit and salad vegetables. Most of the contamination by pathogenic and spoilage organisms is present on the surface of foods at the time of harvesting or is transferred to the surfaces during slaughter and processing. Accurate microbial death models would be of considerable help to the food industry in the development of surface pasteurisation systems for meat, fruit and vegetables. This will in turn lead to safer foods with improved quality and shelf life.



Personnel involved in Bugdeath from left to right

Bugdeath

Partners

1. Food Refrigeration and Process Engineering Research Center (**FRPERC**)
University of Bristol
2. Escola Superior de Biotecnologia (**ESB**)
Universidade Católica Portuguesa
3. Department of Chemical Engineering
Katholieke Universiteit Leuven (**KUL**)
4. Teagasc, The National Food Center (**NFC**)
5. Campden & Chorleywood Food Research Association (**CCFRA**)
6. Faculty of Applied Science
University of West England (**UWE**)
7. Laboratoire de Génie des Procédés Alimentaires (**ENITIA**)
Ecole Nationale d'Ingénieurs des Techniques des Industries Agricoles et Alimentaires
8. Institute National de la Recherche Agronomique (**INRA**)

Bugdeath

Objectives

- microbial inactivation studies at food surfaces
- development of precise and accurate inactivation models
- development of an equipment for surface food pasteurization
'rig apparatus'
- software development for prediction

ESB task

Bugdeath

Foods under study

potato

chicken

meat

microorganisms

Listeria monocytogenes

E. coli

Salmonella

Campylobacter

rig apparatus



Bugdeath

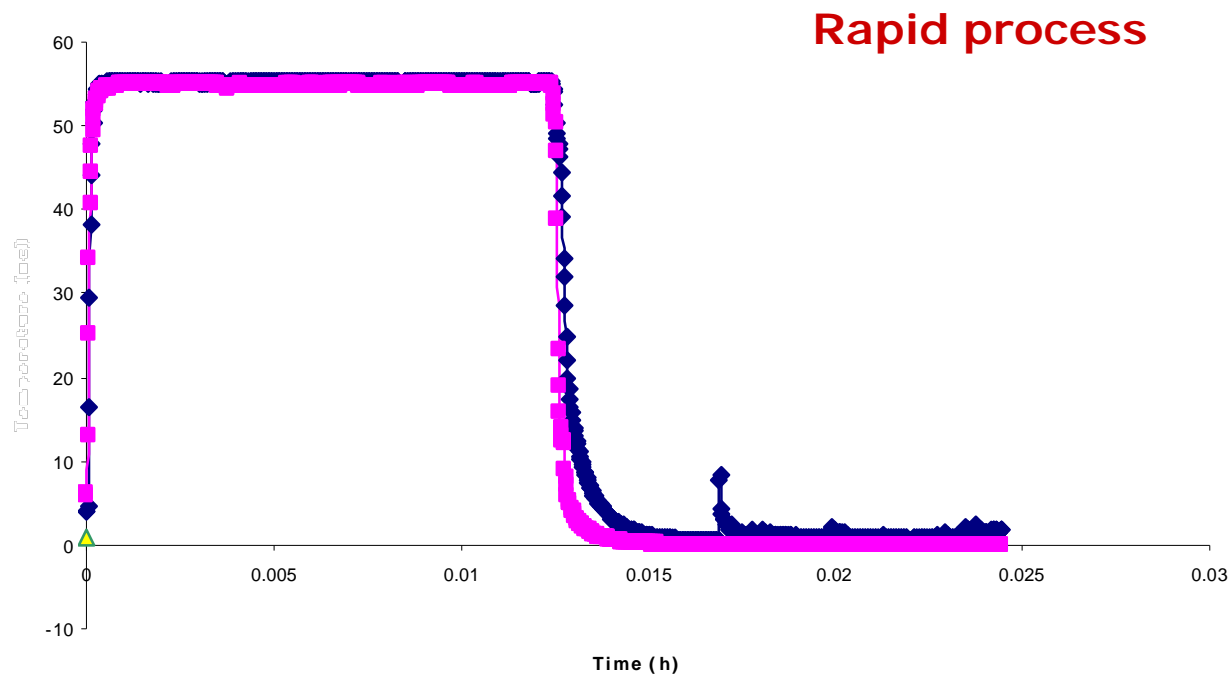
Bugdeath

Thermal processes

- steam
- dry air

Temperature histories

rig apparatus



Different
temperature
histories can
be tested

Escola Superior de Biotecnologia, Universidade Católica Portuguesa

Team

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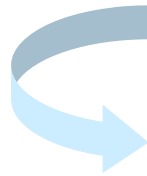
Dissemination session
Chipping Campden, Agosto 2004

Development of a user-friendly
combined heat, mass transfer and
microbial death model

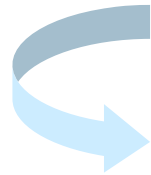


Objectives

- Create a software application



User-friendly tool



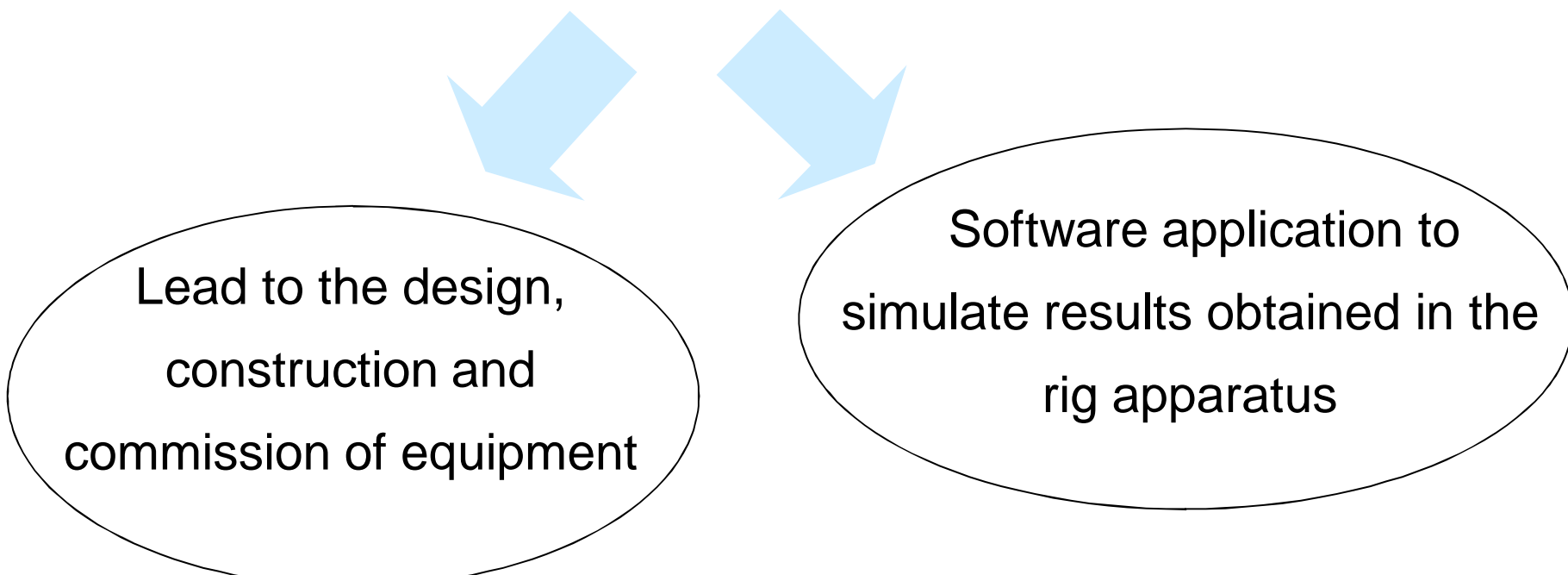
foods

Simulation of inactivation kinetics of
microorganisms on the surface of
during pasteurisation treatments



Introduction

- Need to obtain reliable data on relationship between microbial death and the surface temperature of real foods

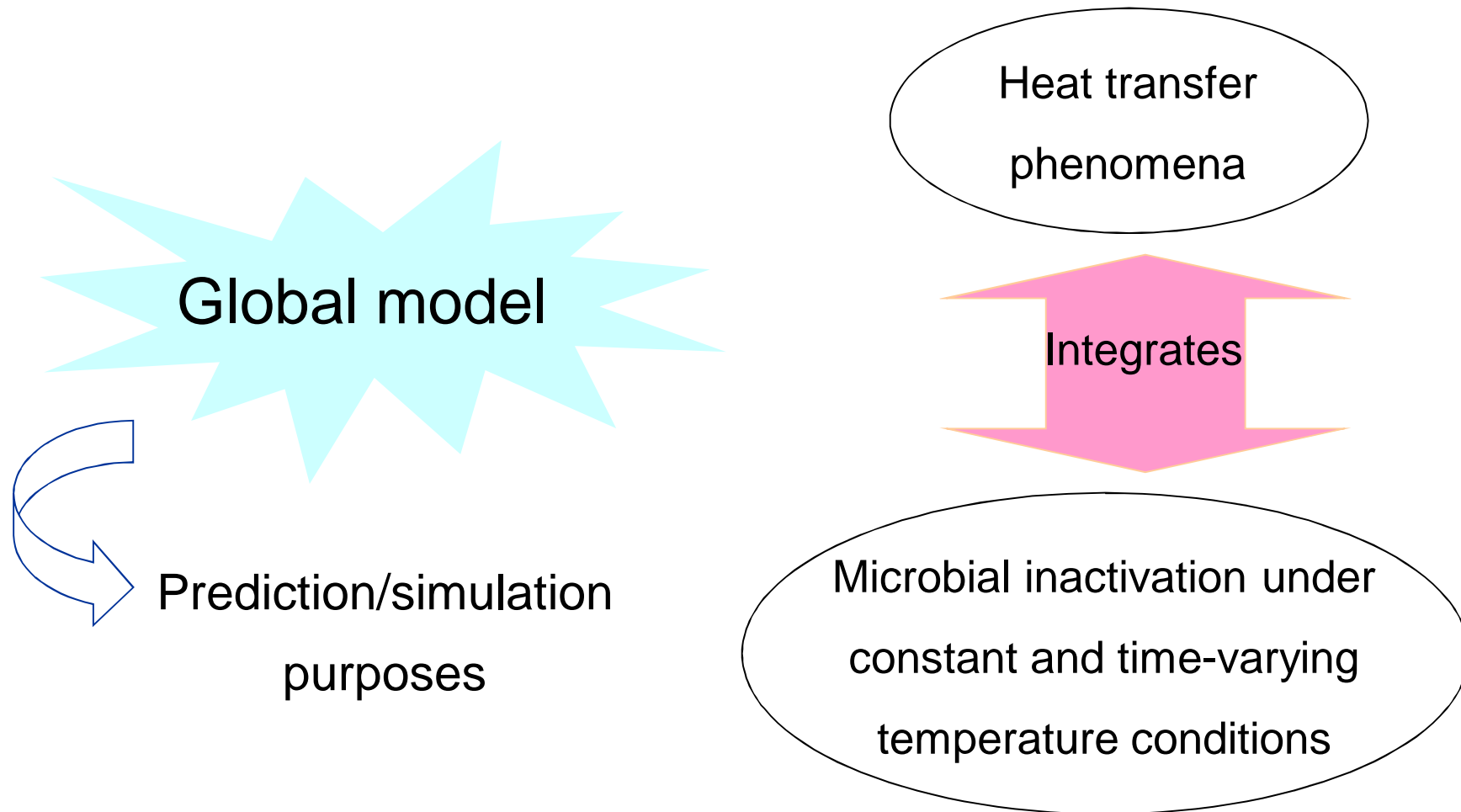


Lead to the design,
construction and
commission of equipment

Software application to
simulate results obtained in the
rig apparatus



Modelling



Modelling

two modelling approaches

- Accurate modelling of heat transfer
 - Description of the phenomena induced to the food surface by a thermal process
- Modelling microbial inactivation behaviour under such temperature conditions



Heat transfer model

estimation of surface temperature

- One dimensional heat transfer model
- Combination of different phenomena
 - Conduction
 - Convection
 - Evaporation/condensation of water or steam
 - Radiation (not considered)



Heat transfer model

- Simplified model

Conduction/convection - Fourier

Geometry – plane sheet

No mass transfer phenomena considered



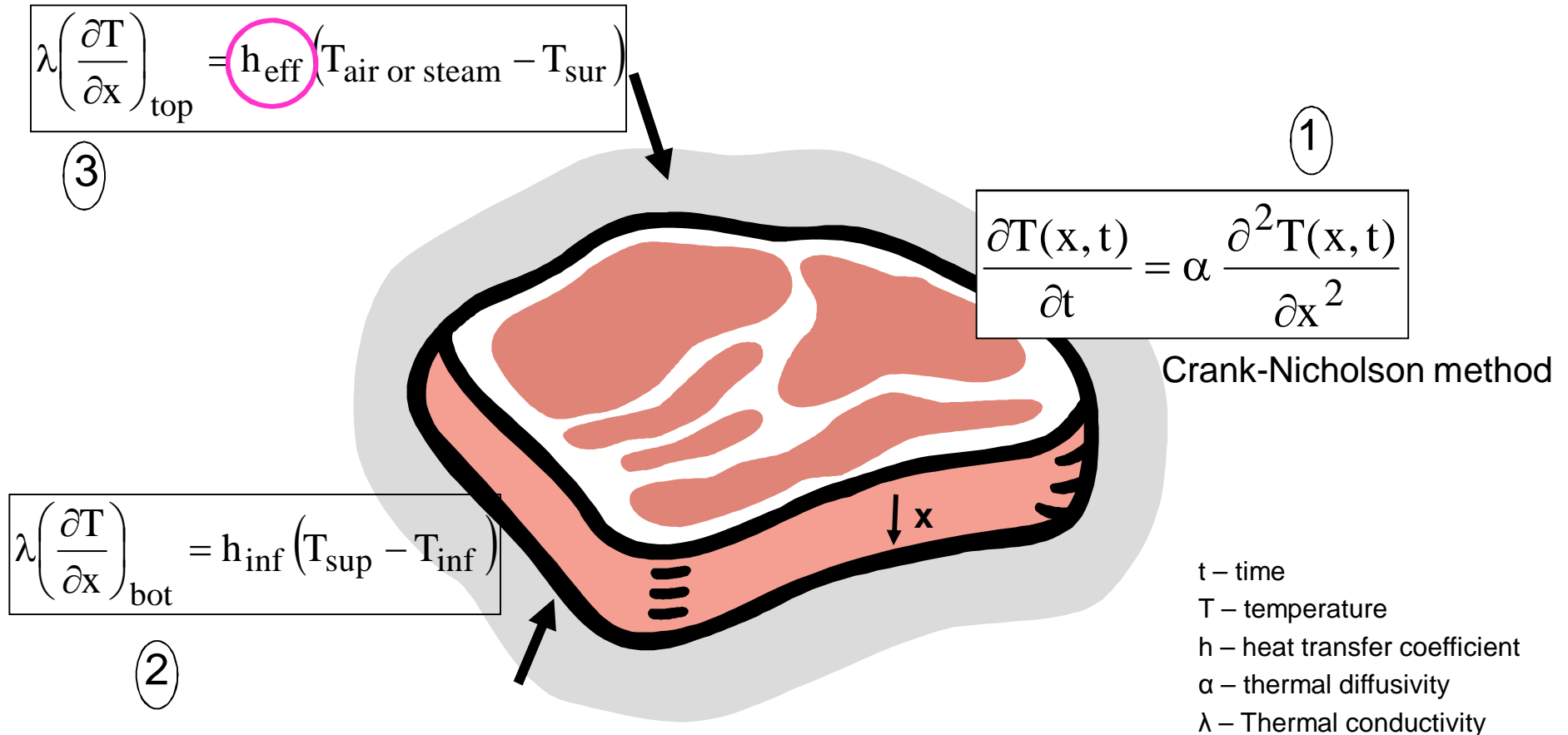
- Limits

Air velocity ranged from 15 m/s to 25 m/s

Extrapolation locked outside of conditions that can be verified in the test rig

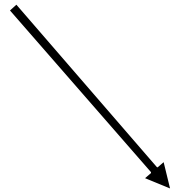


Heat transfer model



Boundary conditions - bottom

Exchanges between the bottom of the product and the support can be neglected – product thickness < 0.5 cm



Experimentally observed in the rig



Heat transfer model

$$\lambda \left(\frac{\partial T}{\partial x} \right)_{\text{top}} = h_{\text{eff}} (T_{\text{air or steam}} - T_{\text{sur}})$$

(3)

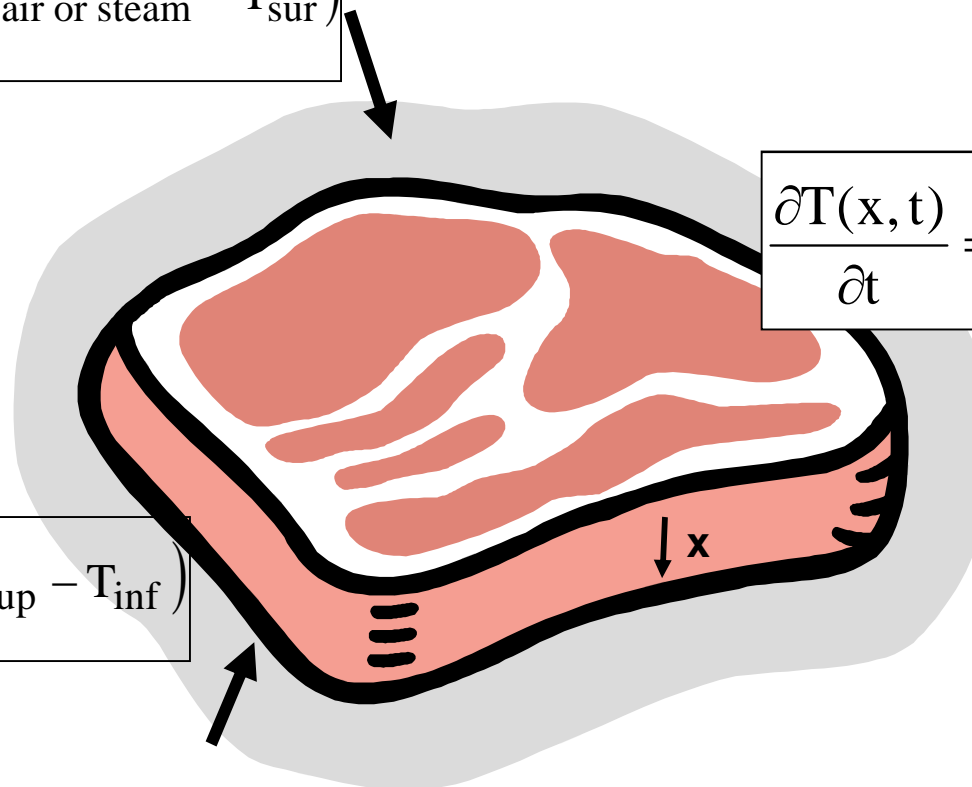
(1)

$$\frac{\partial T(x, t)}{\partial t} = \alpha \frac{\partial^2 T(x, t)}{\partial x^2}$$

Crank-Nicholson method

$$\lambda \left(\frac{\partial T}{\partial x} \right)_{\text{bot}} = h_{\text{inf}} (T_{\text{sup}} - T_{\text{inf}})$$

(2)



t – time
 T – temperature
 h – heat transfer coefficient
 α – thermal diffusivity
 λ – Thermal conductivity



Effective coefficient – dry conditions

$$h_{\text{eff}} = h \frac{T_{\text{air}} - T_{\text{sur}}}{T_{\text{max}} - T_{\text{sur}}} + K_m \Delta H \frac{P_T - a_{w_{\text{sur}}} P_{T_{\text{sur}}}}{T_{\text{max}} - T_{\text{sur}}}$$

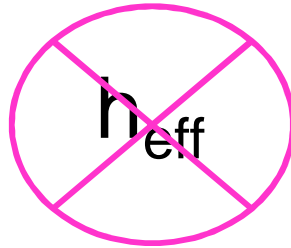
convection evaporation

k_m – mass transfer coefficient

ΔH – latent heat of water evaporation

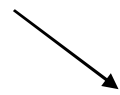


Effective coefficient – wet conditions (steam)



Due to complexity of mathematical expressions to be incorporated in the software

$$T_{\text{sur}} = T_{\text{steam}} - 3^{\circ}\text{C}$$



Experimentally observed in the rig



Microbial inactivation model

- To predict microbial content at the surface of foods
- It has the advantage of dealing with time-varying temperature conditions
- Typical of pasteurisation treatments



Microbial inactivation model

$$\frac{dN}{dt} = -k_{\max} k_Q(Q)N$$

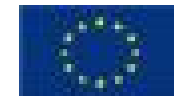
$$\frac{dQ}{dt} = -k_{\max} Q$$

N – microbial cell density

Q – variable related to the physiological state of the cells

k_{\max} – inactivation rate constant

$$\log \frac{N}{N_0} = \log(\exp(-k_{\max} t)) \frac{1 + Q(0)}{1 + Q(0) \exp(-k_{\max} t)}$$



Microbial inactivation model

$$k_{\max}(T, a_w) = \frac{\ln 10}{D_{ref}} \exp\left(\frac{\ln 10}{z} (T - T_{ref})\right) \exp\left(\frac{\ln 10}{z_{a_w}} (a_w - 1)\right) + c1$$



$T = T_{sur} \rightarrow$ Calculated on the basis of all considerations of heat transport



Software Program



'Bugdeath' - funded by the European Commission under the EC Framework 5;
Quality of Life and Management of Living Resources Programme



Software Program

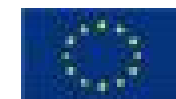
- The programme was developed using Real Basic® 5.2 application
- Food/microorganism selection is allowed
(database of thermal properties and kinetic parameters)
- On the basis of the selection of a heating regime of the medium, the programme allows prediction of the food surface temperature and simulates the microbial load content along the whole process time



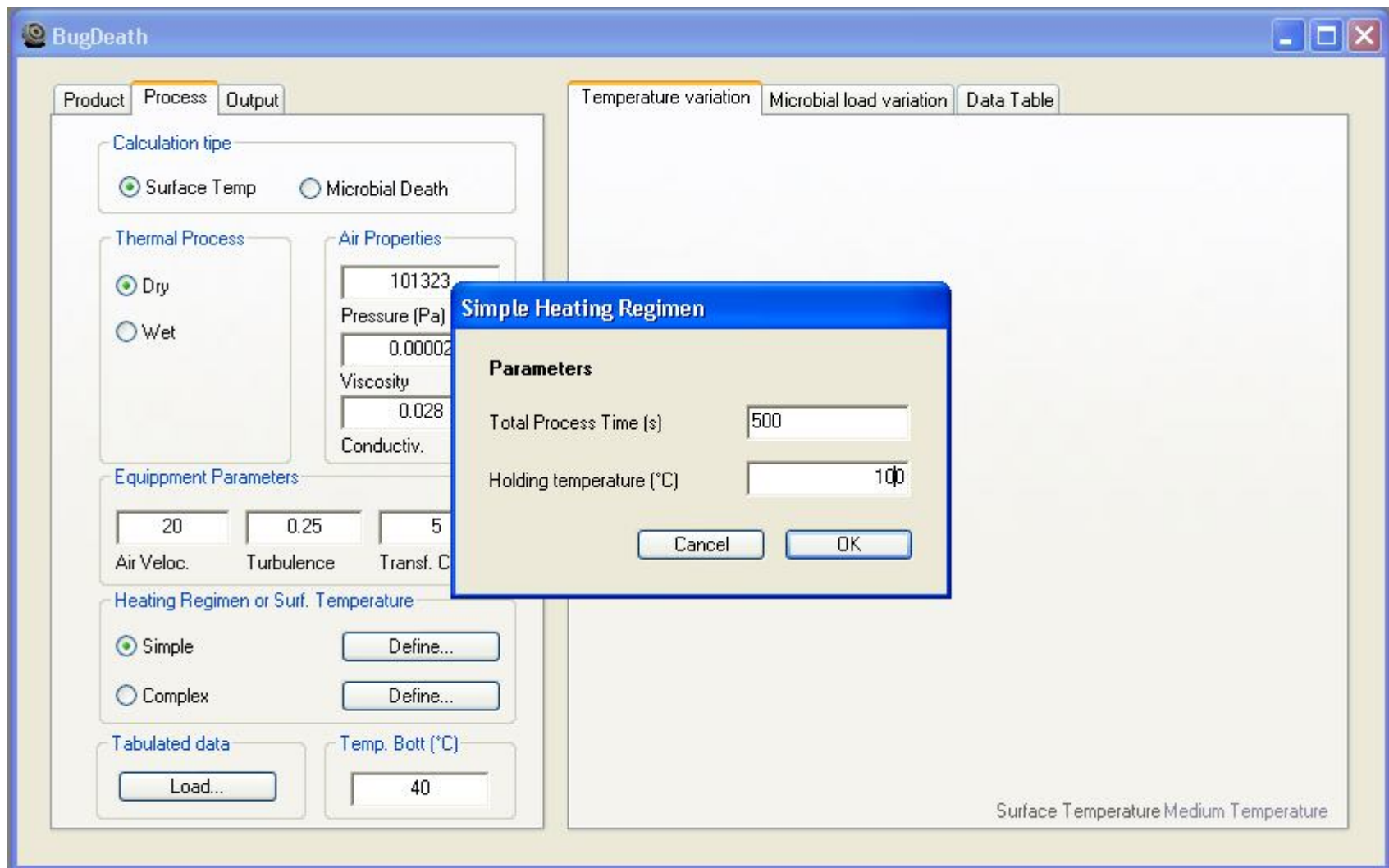
First screen – product/microorganism

The screenshot shows the 'BugDeath' software interface. The window title is 'BugDeath'. There are three tabs: 'Product', 'Process', and 'Output'. The 'Product' tab is active. Below the tabs, there are two main sections: 'Product' and 'Microorganism'. The 'Product' section includes a dropdown menu for 'Beef', and input fields for 'Diffusivity' (1.23e-07), 'Conductivity' (4.5e-01), 'Product thickness (m)' (0.016), 'Init. Product Temp. (°C)' (13.4), 'Sample Diameter (m)' (0.05), and 'Water activity' (0.45). The 'Microorganism' section includes a dropdown menu for 'S. typhimurium', and input fields for 'D (min)' (6.6e+1), 'Safe Count' (1.e+0), 'Initial Count' (10000000), 'Z (°C)' (7), 'Z(aw)' (0.2), 'R. Temp. (°C)' (57.2), 'Z(aw)' (0.2206), and 'R. Temp. (°C)' (2.279372077). There are also labels 'C1' and 'Q0' at the bottom of the input fields. On the right side, there are three tabs: 'Temperature variation', 'Microbial load variation', and 'Data Table'. The 'Temperature variation' tab is active, and it contains a large empty area. At the bottom right of the window, there are labels 'Surface Temperature', 'Medium Temperature', and 'Temperature'.

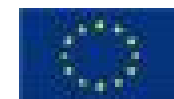
'Bugdeath' - funded by the European Commission under the EC Framework 5;
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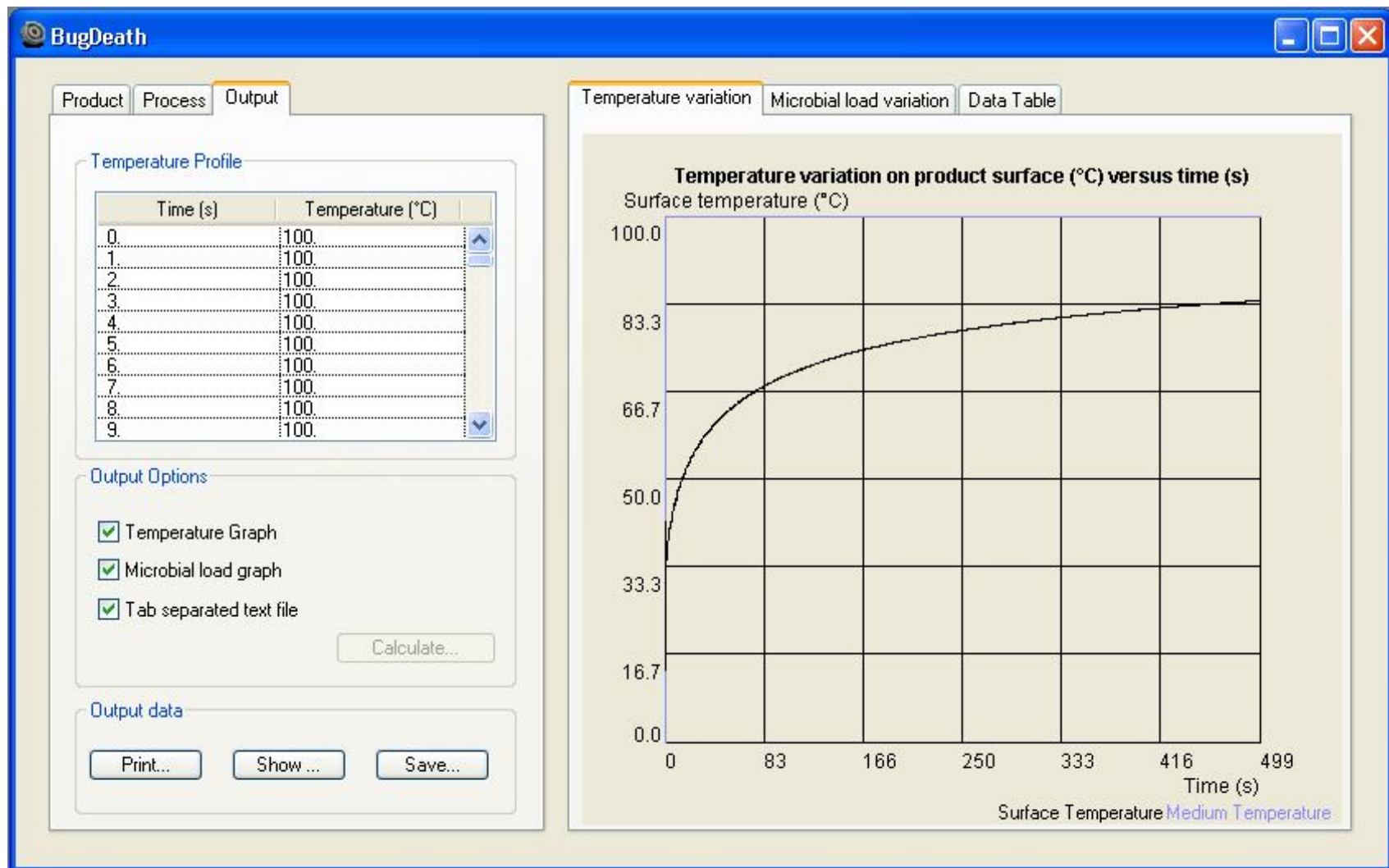
Second screen – process



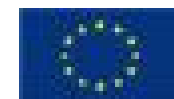
'Bugdeath' - funded by the European Commission under the EC Framework 5;
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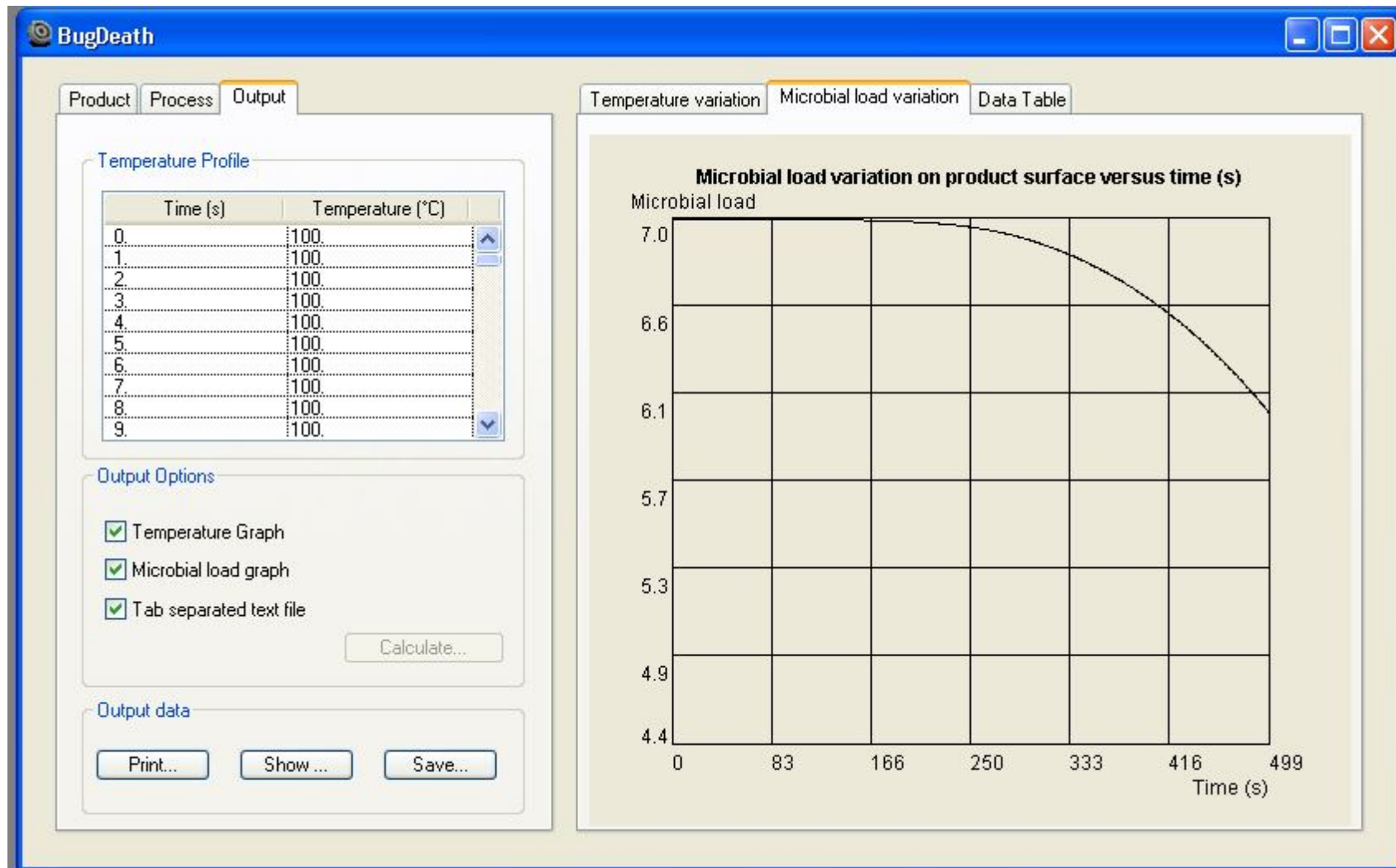
Output – graphic/temperature



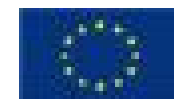
'Bugdeath' - funded by the European Commission under the EC Framework 5;
Quality of Life and Management of Living Resources Programme



Output – graphic/microbial load



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Output – data table

The screenshot shows the 'BugDeath' software interface. The 'Data Table' tab is active, displaying a table with the following data:

Time (s)	Medium Temp. (°C)	Surface Temp. (°C)	Microbial Load
0	0	14.02522	7
0.6081229	100	39.29868	6.991117
1	100	31.74754	6.991117
1.608123	100	35.68345	6.991117
2	100	36.00534	6.991117
2.608123	100	36.9512	6.991117
3	100	38.14414	6.991117
3.608123	100	38.62585	6.991117
4	100	39.78456	6.991117
4.608123	100	40.16022	6.991117
5	100	41.19636	6.991117
5.608123	100	41.524	6.991117
6	100	42.4504	6.991117
6.608123	100	42.74452	6.991117
7	100	43.58093	6.991117
7.608123	100	43.84836	6.991117
8	100	44.61078	6.991117
8.608123	100	44.85613	6.991117
9	100	45.55682	6.991117
9.608123	100	45.78353	6.991117
10	100	46.43196	6.991117
10.60812	100	46.64271	6.991116
11	100	47.2463	6.991116
11.60812	100	47.44323	6.991116
12	100	48.0079	6.991116
12.60812	100	48.19275	6.991116
13	100	48.72329	6.991115
13.60812	100	48.89746	6.991115
14	100	49.39783	6.991115

The interface also includes a 'Temperature Profile' table showing a constant temperature of 100°C over 9 seconds, and 'Output Options' where 'Temperature Graph', 'Microbial load graph', and 'Tab separated text file' are all checked. A 'Calculate...' button is present below the options.

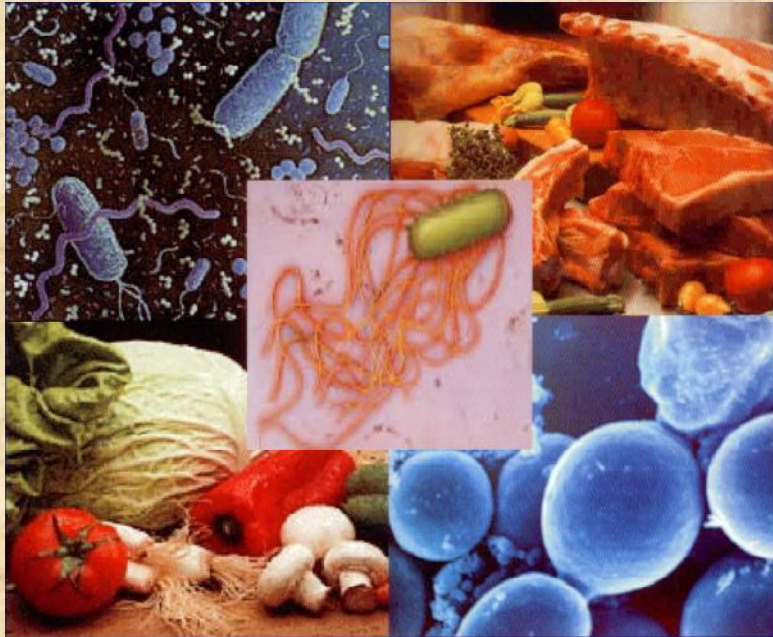
'Bugdeath' - funded by the European Commission under the EC Framework 5;
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Conclusions / outputs

- Software application simulates the results obtained in the rig apparatus
- Valuable for developing appropriate and safety thermal processes
- Marketed and commercially available
- Educational purposes (simulation of real food processes)





Predictive Microbiology

A tool to support food safety decisions

Thank you

Teresa Brandão and Cristina Silva



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Escola Superior de Biotecnologia

7th December 2007