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Modelling of Crystallisation Kinetics of Cocoa Butter and Milk Fat

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Overview

- why model crystallisation kinetics?
- existing models
- presentation of the new model
- model selection: which one gives the best fit?
- take home message



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Why model crystallization kinetics?

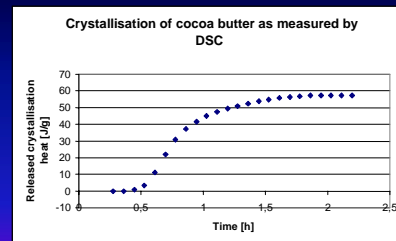
- to gain insight in/quantify/predict effects of
 - fat composition
 - differences in fat origin
 - processing conditions
 - temperature (profiles)
 - additives / minor components
- our focus on:
 - milk fat
 - cocoa butter
 - Belgian chocolate



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Why model crystallization kinetics?

Typical data set



Summarize in (small) number of characteristic numbers



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Existing models: Avrami (Avrami, 1940)

$$f(t) = a_A \times (1 - \exp(-k \times t^m))$$

t: time [h]

f(t): amount of crystallisation [% or J/g]

a_A : value of f as t approaches infinity [as f(t)]

k: crystallisation rate constant [h^{-m}]

m: Avrami exponent []

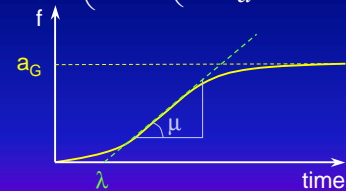


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Existing models: Gompertz model

(Zwietering et al., 1990)

$$f(t) = a_G \times \exp\left(-\exp\left(-\frac{\mu}{a} \times (t - \lambda) + 1\right)\right)$$



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New model: background

(Foubert et al., accepted for publication Food Research International)

- (Wunderlich, 1990): phase transitions can be written in the form of a chemical reaction



for kinetic description: same equations as for chemical reactions

- crystallisation process:
 - first order forward reaction
 - reverse reaction order n

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New model: mathematical representation

$$\frac{dh}{dt} = K_n \times h^n - K_1 \times h \quad h(t) = \frac{a_F - f(t)}{f(t)}$$

f(t): amount of crystallisation [% or J/g]

a_F: value of f as t approaches infinity [as f(t)]

h: relative remaining crystallisable fat (0 < h < 1) []

K_i: rate constants [h⁻¹]

n: order of the reverse reaction []

h(t=0) = h₀

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New model: simplified version

parameter estimation studies:

difference between K₁ and K_n is only 1.10⁻⁴ %

$$\frac{dh}{dt} = K \times (h^n - h) \quad h(0) = \frac{a_F - f(0)}{f(0)}$$

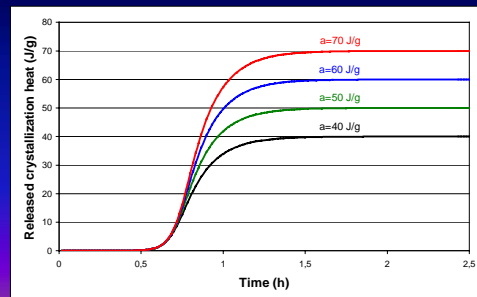
quality of original model not significantly better than simplified version

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New model: the four parameters

- a: value as t approaches infinity
- f(0) = 1.10⁻⁵ J/g K = 6 h⁻¹ n = 5

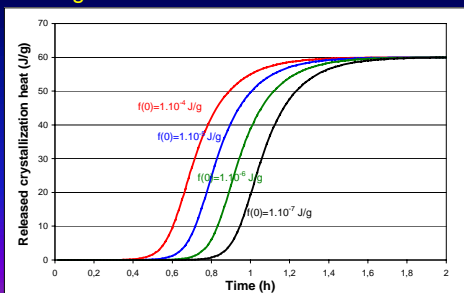


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New model: the four parameters

- f(0) related to induction time
- a = 60 J/g K = 6 h⁻¹ n = 5

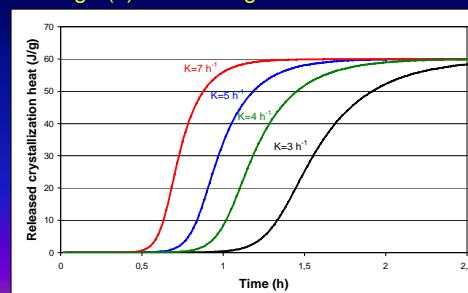


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New model: the four parameters

- K: rate of crystallisation, also of crystallisation start
- a = 60 J/g f(0) = 1.10⁻⁵ J/g n = 5



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New model: the four parameters

- n related to degree of curve asymmetry
- definition of asymmetry:

$$asym = \frac{t_{90\%} - t_{50\%}}{t_{50\%} - t_{10\%}} \quad \text{or equivalent}$$

- relation between n and asym:

$$n = 2 \quad asym = 1$$

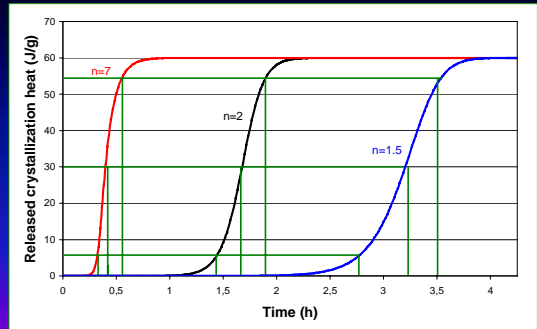
$$n < 2 \quad asym < 1$$

$$n > 2 \quad asym > 1$$

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New model: the four parameters



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Advantages of differential equation

- easier to interpret mechanistically
- easier to make minor changes on basis acquired knowledge
- also useful for time-varying process conditions e.g. non-isothermal processes combination with secondary models (temperature dependency of model parameters)

BUT

parameter estimation not so straightforward

→ also algebraic solution

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New model: algebraic solution

- $f(0)$ related to induction time
- physical interpretation of 'induction time' more straightforward + easier to extract from curve
→ represent as function of induction time
- $t_{ind,x}$: time needed to reach x% crystallisation

$$h = \left[1 + \left((1-x)^{1-n} - 1 \right) \exp(- (1-n) \times K \times (t - t_{ind,x})) \right]^{\frac{1}{1-n}}$$

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Model selection

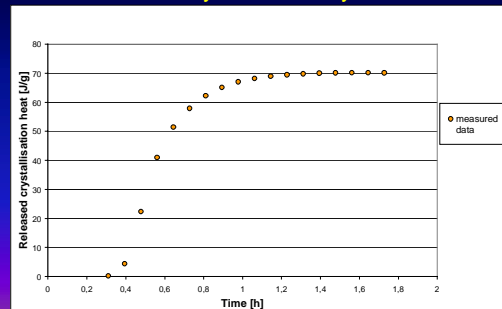
- fit the three models to different data series (53)
- different samples (different cocoa butters + milk fat samples)
- different temperatures
- different measuring techniques (DSC + pNMR)
- visual model selection
- mathematical model selection

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Model selection: visual

cocoa butter crystallisation by means of DSC

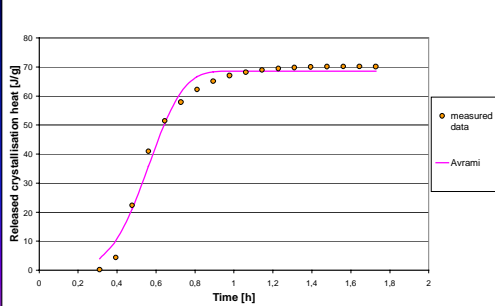


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Model selection: visual

cocoa butter crystallisation by means of DSC

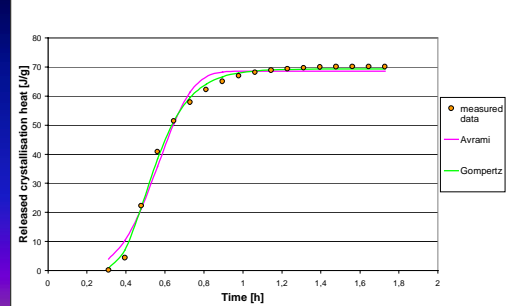


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Model selection: visual

cocoa butter crystallisation by means of DSC

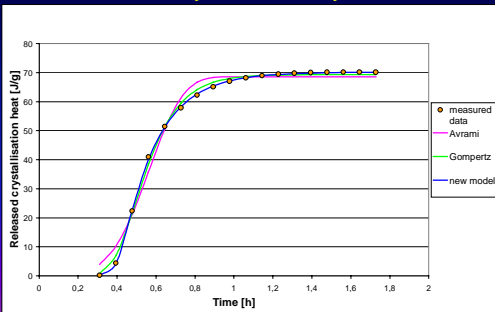


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Model selection: visual

cocoa butter crystallisation by means of DSC



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Model selection: mathematical

- four information criteria: based on sum of squared residuals (SSR) → indication of how much predicted curve differs from measured curve, compensate in different ways for model complexity
- statistical F-test: is a more complex model significantly better than more simple model? (different number of parameters)
- analysis of residuals (measured – predicted value): should be random and independent: autocorrelation and run tests
- details: specialised textbook

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Model selection: mathematical

	FPE	AIC	BIC	LILC	F-test	Run	Autocorr
ModelA	0%	0%	0%	0%	0%	0%	0%
ModelG	21%	23%	21%	17%	13%	8%	2%
ModelF	79%	77%	79%	83%	77%	87%	21%
ModelFG	0%	0%	0%	0%	10%	5%	21%
ModelAF	0%	0%	0%	0%	0%	0%	3%
All equal	0%	0%	0%	0%	0%	0%	53%

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Model selection: mathematical

comparison of mean sum of squared residuals (MSR): model better if MSR is smaller

Gompertz: some very good fits, some significantly poorer fits

new model: more or less constant value, thus more flexible

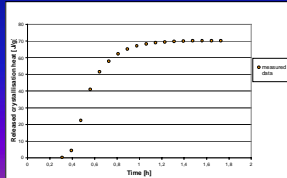
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Asymmetry of models

$$asym = \frac{t_{90\%} - t_{50\%}}{t_{50\%} - t_{10\%}}$$

- Avrami: asym depends on m
- m values coincide with asym around 1 or smaller = start of crystallisation slower



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Asymmetry of models

- Gompertz: asym = constant
no flexibility concerning asymmetry
explains why some very good fits and some significantly worse
- new model: asym depends on n
 - n = 2 asym = 1
 - n < 2 asym < 1
 - n > 2 asym > 1
 flexibility concerning asymmetry

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Take home message

- new model to describe crystallisation kinetics of fats
- ADVANTAGES:
 - differential equation → time-varying conditions (e.g. non-isothermal crystallisation)
 - algebraic solution for isothermal conditions: easy parameter estimation
 - quality of fit always better than Avrami, better than Gompertz for majority of data series
 - high flexibility: good fit for different samples, processing conditions, measuring techniques

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