

# Model-based analysis and experimental validation of residence time distribution in twin-screw granulation

*Ashish Kumar*

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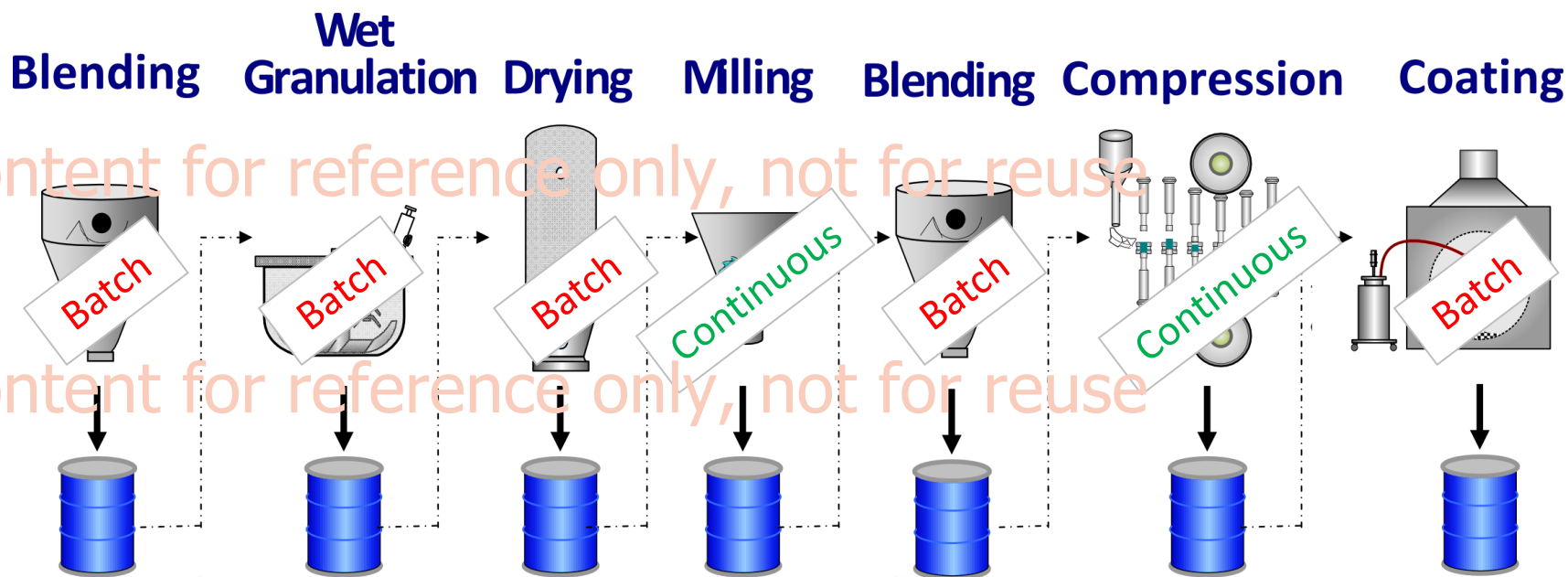
LABORATORY OF PHARMACEUTICAL PROCESS ANALYTICAL TECHNOLOGY

FACULTY OF PHARMACEUTICAL SCIENCES

ISCOMATH, DEPARTMENT OF MATHEMATICAL MODELLING, STATISTICS AND BIOINFORMATICS

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# Current solid-dosage manufacturing is slow and expensive

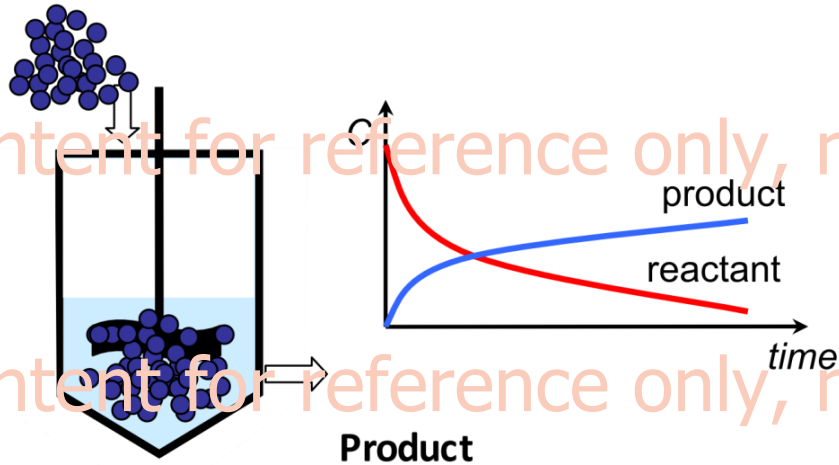


Product collected after each unit operation

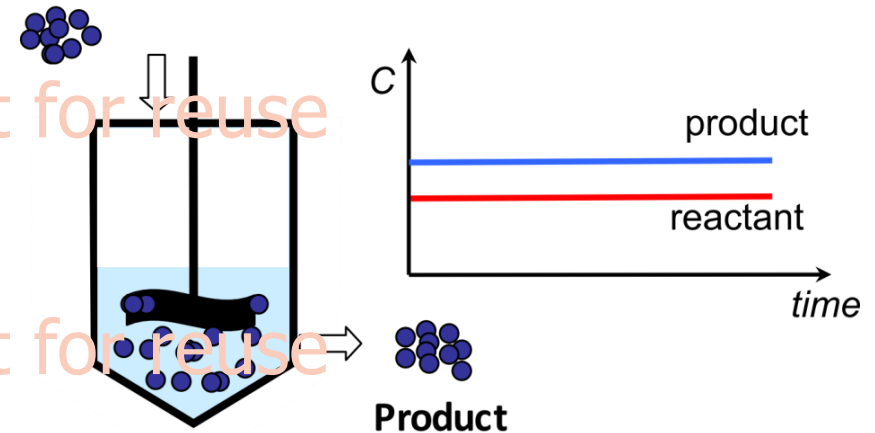
Actual processing time = days to weeks

# Continuous manufacturing is better

## Batch



## Continuous

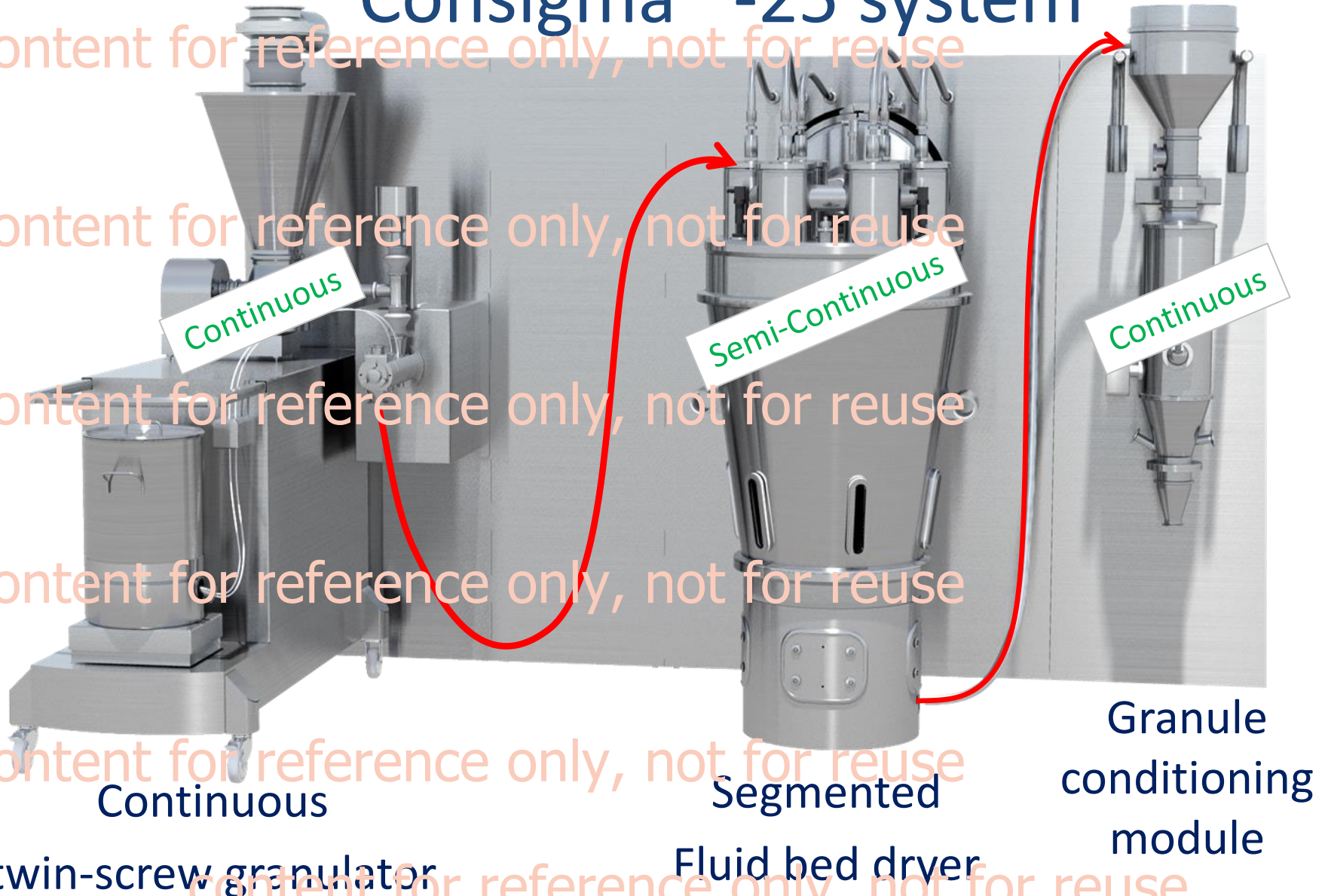


- ✗ No feed and effluent
- ✗ Concentration is time variant
- ✗ High variability
- ✓ Process control is easy

- ✓ Constant feed and effluent
- ✓ Concentration are constant
- ✓ Low variability
- ✗ Rigorous control required

# Continuous manufacturing line

## Consigma™-25 system



Continuous

Semi-Continuous

Continuous

Continuous

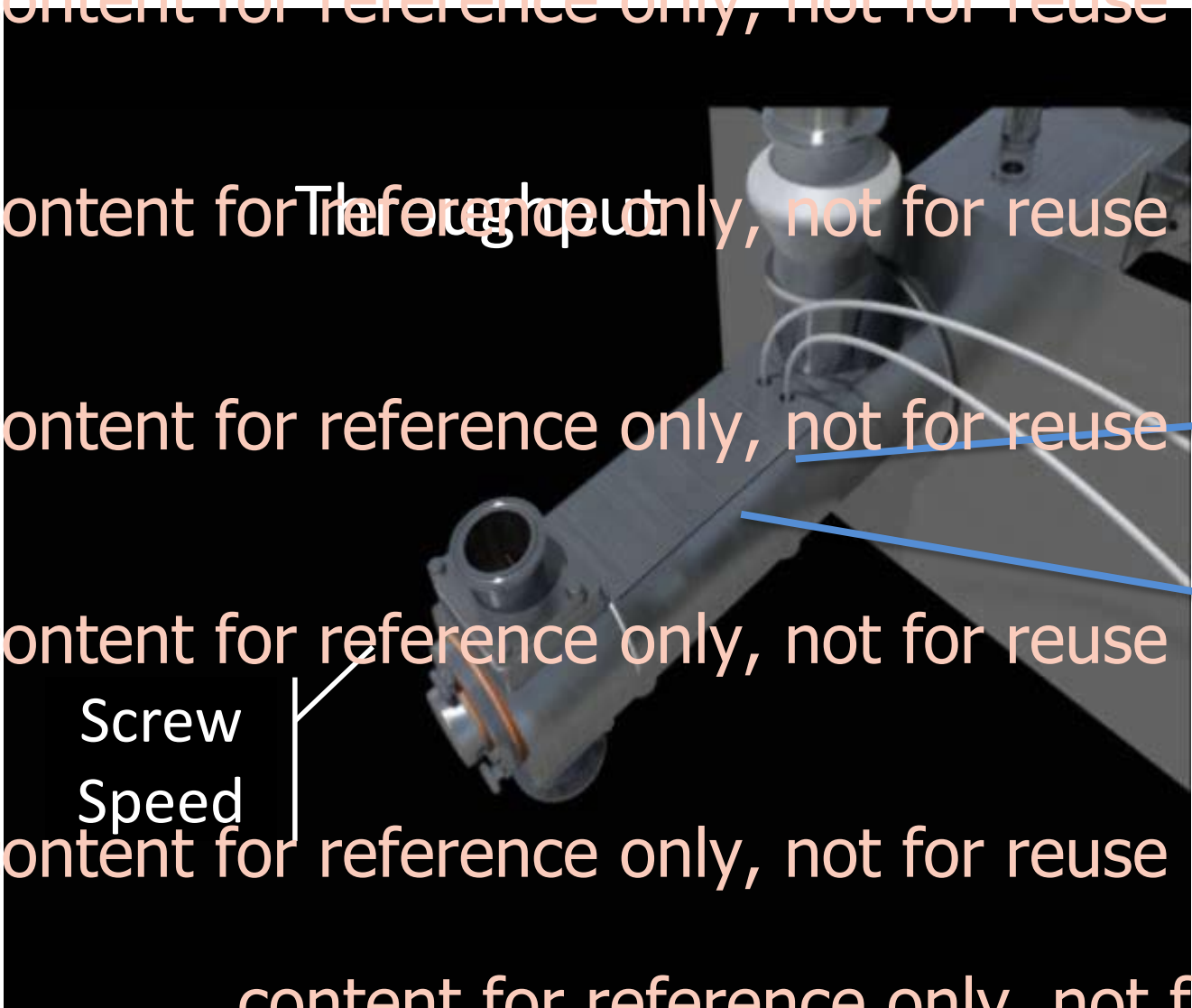
twin-screw granulator

Segmented

Fluid bed dryer

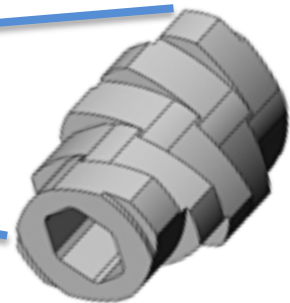
Granule  
conditioning  
module

# Design of granulator screw, screw speed, material feed rate control granulation



Throughput

Number of kneading discs and stagger angle



Screw Speed

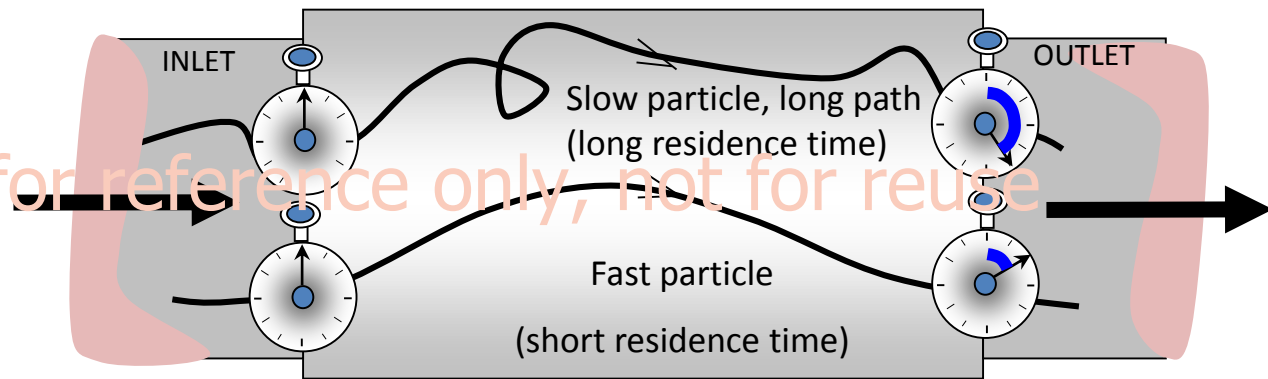
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# Residence time distribution to know

## the granulation time and mixing

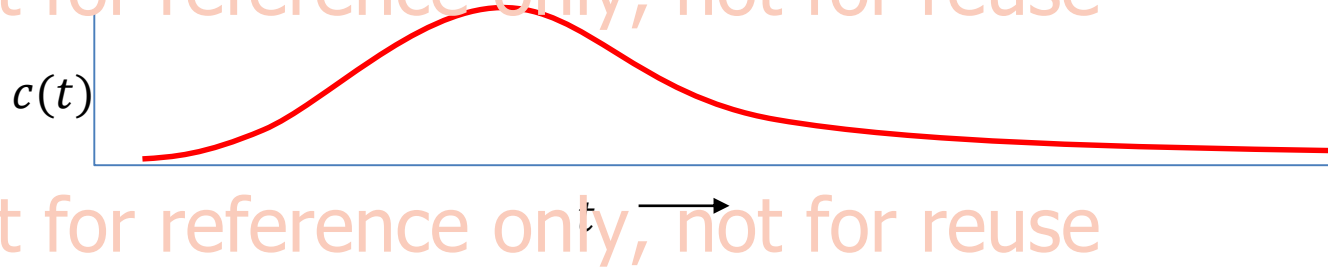
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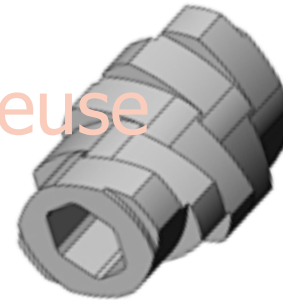
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# Residence time distribution to know the granulation time and mixing

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## Screw Configuration

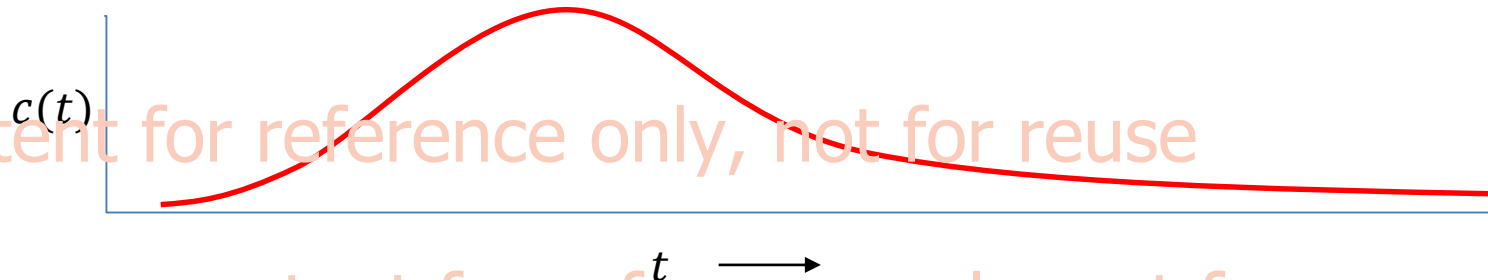
- Number of kneading discs
- Stagger angle



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## Process parameters

- Material throughput
  - Screw speed
- content for reference only, not for reuse



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# Analysis of residence time distribution in twin-screw granulation

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## RTD Measurement by Chemical Imaging

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## Model Formulation

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## Outcomes

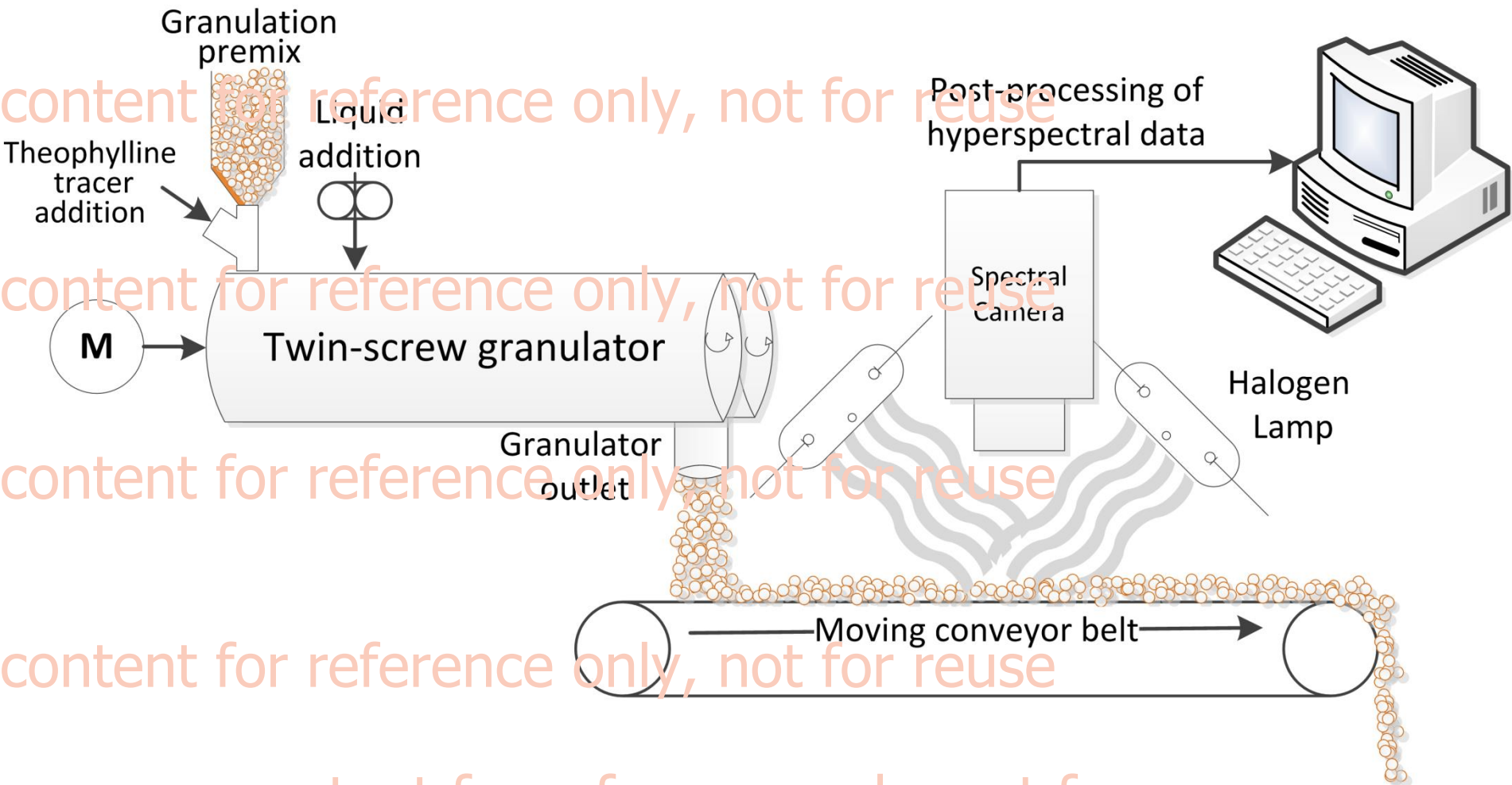
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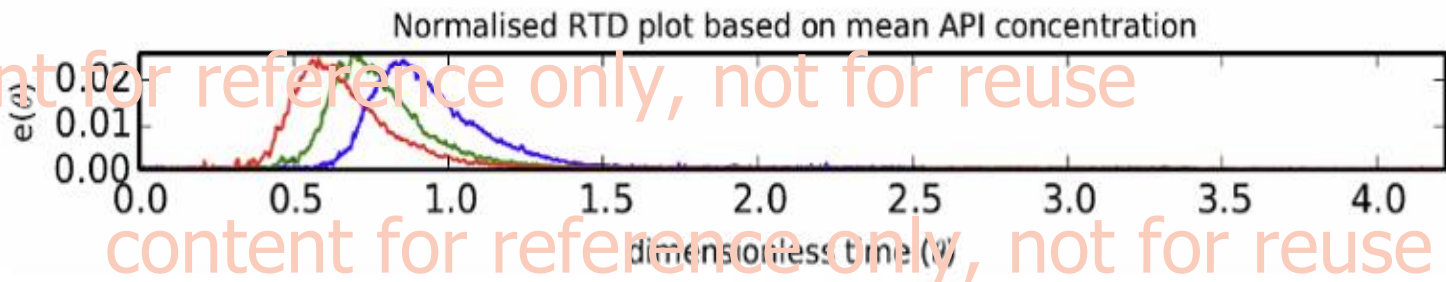
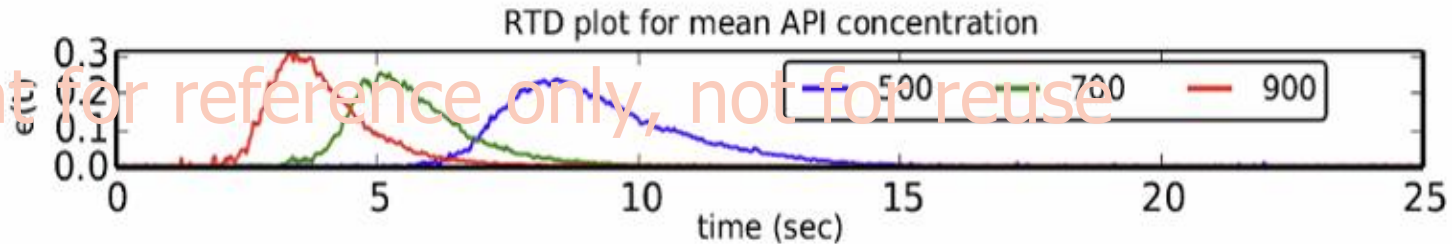
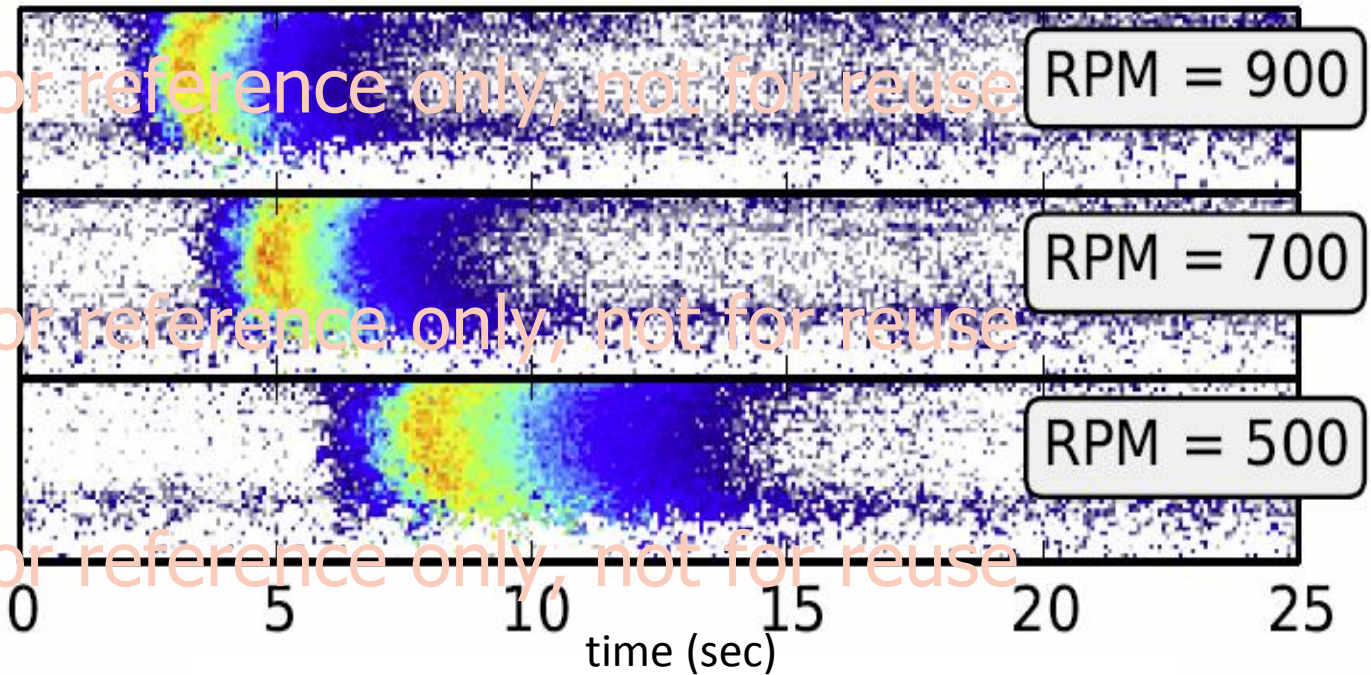
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# Tracer concentration in granules produced was measured using NIR chemical imaging



# API Map was used to measure RTD



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# Analysis of residence time distribution in twin-screw granulation

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## RTD Measurement by Chemical Imaging

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### Model Formulation

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### Outcomes

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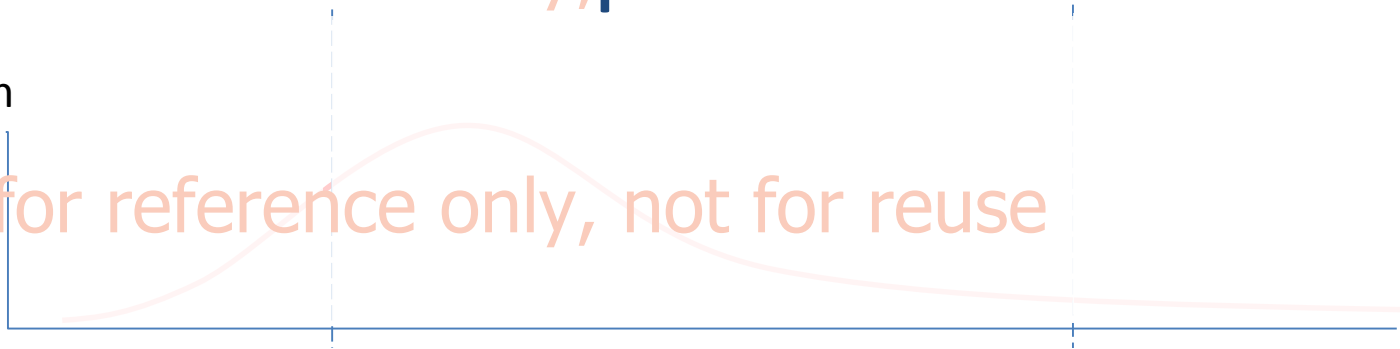
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# Conceptual model to include three main components of RTD

Tracer addition

$e(t)$



Modified Tank-in-Series model used

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# Modified Tank-In-Series model

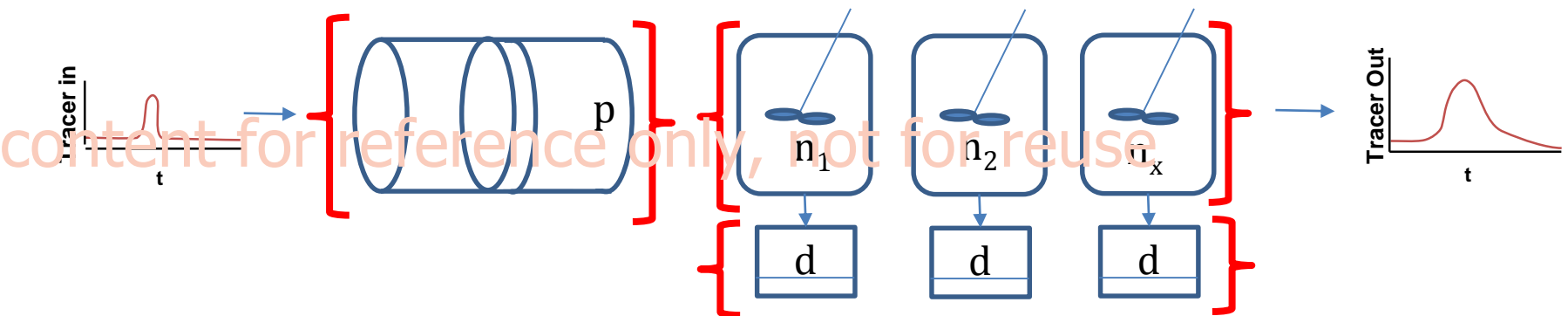
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$$e(\theta) = \frac{b[b(\theta - p)]^{n-1}}{(n-1)!} \exp[-b(\theta - p)]$$

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$$\text{where, } b = \frac{n}{(1-p)(1-d)}$$

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Source: Levenspiel, Chemical Reaction Engineering, 1999

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# Analysis of residence time distribution in twin-screw granulation

RTD measurement by Chemical imaging

Model Formulation

Outcomes

Measurement based {  
- Mean residence time  
- Mean centred variance

Model based {  
- Number of CSTR  
- Plug flow fraction  
- Dead volume fraction

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$$\tau = \frac{\int_0^{\infty} t \cdot e(t) dt}{\int_0^{\infty} e(t) dt}$$

**Mean residence time ,  $\tau$**   
(a measure of the mean of the distribution)

$$\sigma^2 = \frac{\int_0^{\infty} (t-\tau)^2 \cdot e(t) dt}{\int_0^{\infty} e(t) dt}$$

**Variance,  $\sigma^2$**   
(width of the distribution)

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# Analysis of residence time distribution in twin-screw granulation

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Chemical imaging based RTD measurement

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Model Formulation

## Outcomes

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- Measurement based {
  - Mean residence time
  - Mean centred variance

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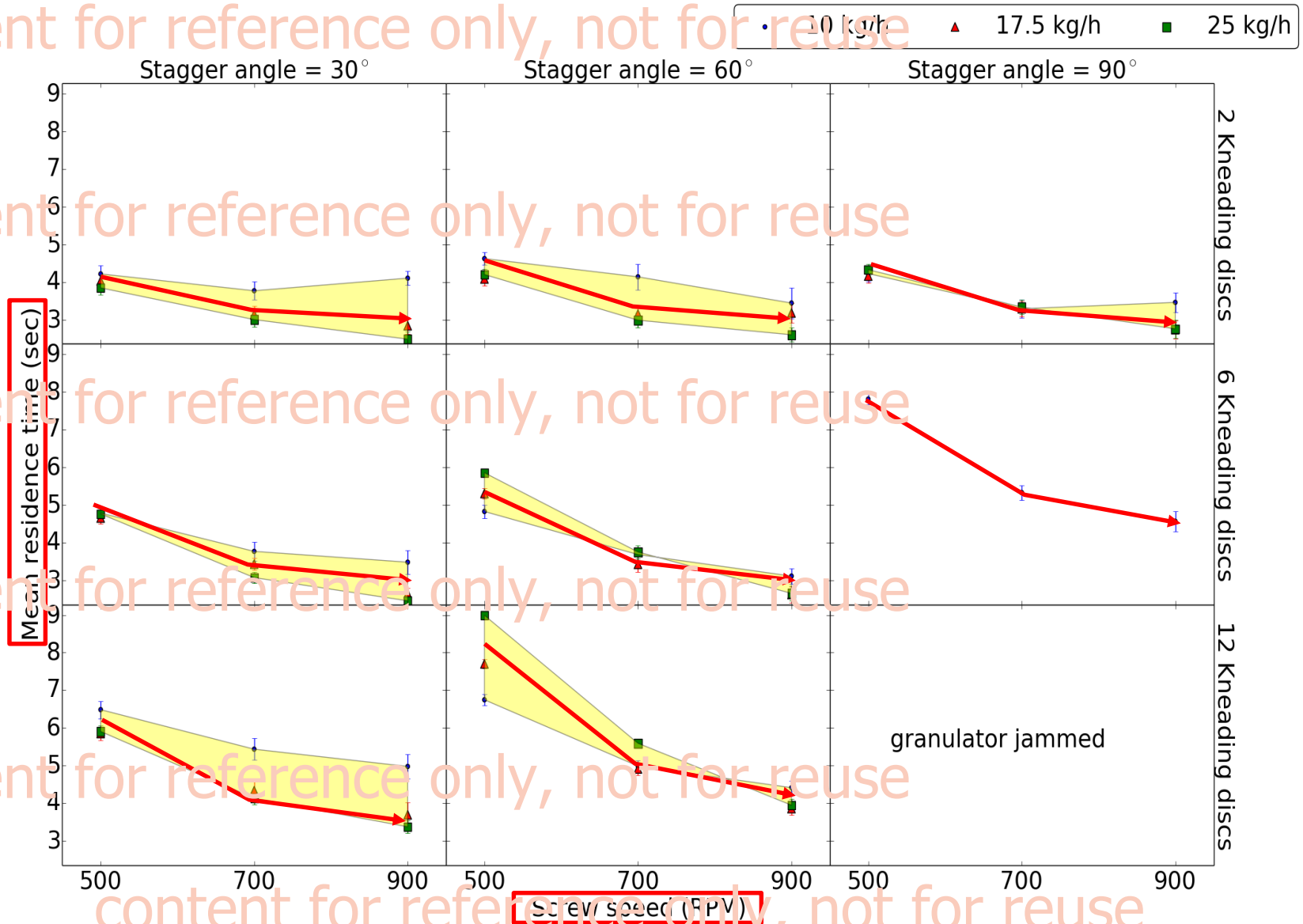
- Model based {
  - Number of CSTR
  - Plug flow fraction
  - Dead volume fraction

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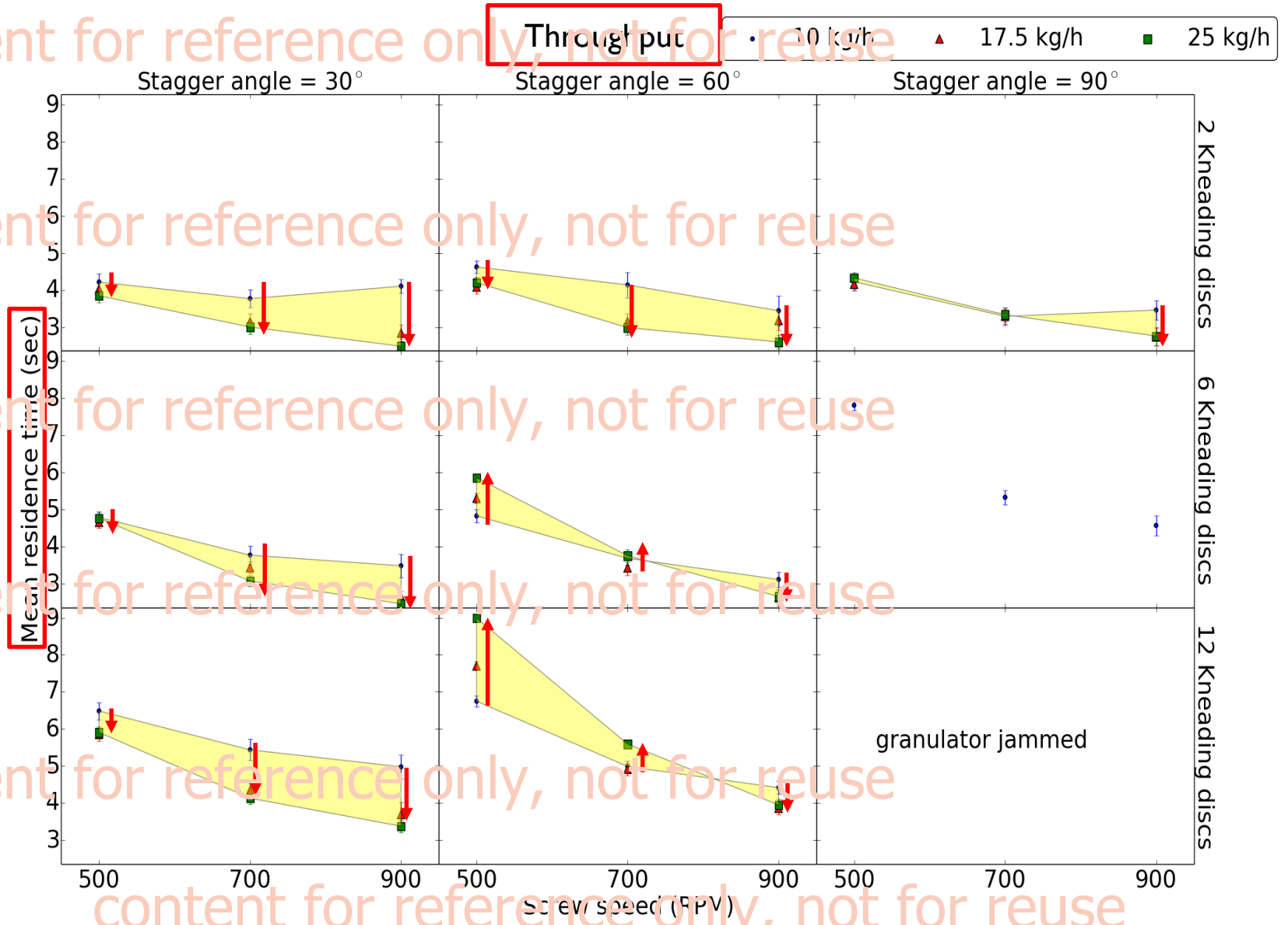
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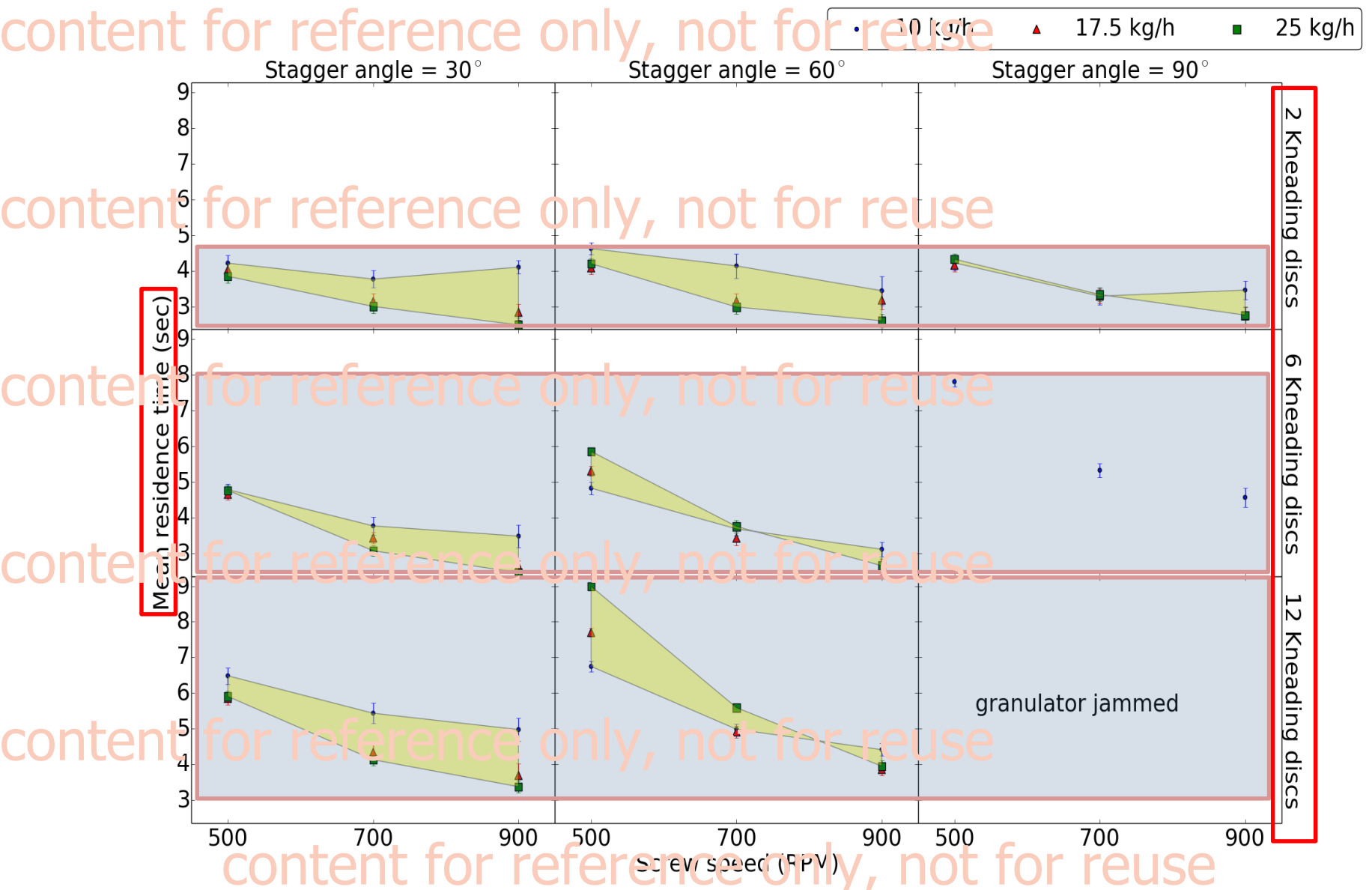
# Residence time reduces with increase in Measure of the mean of the distribution screw speed



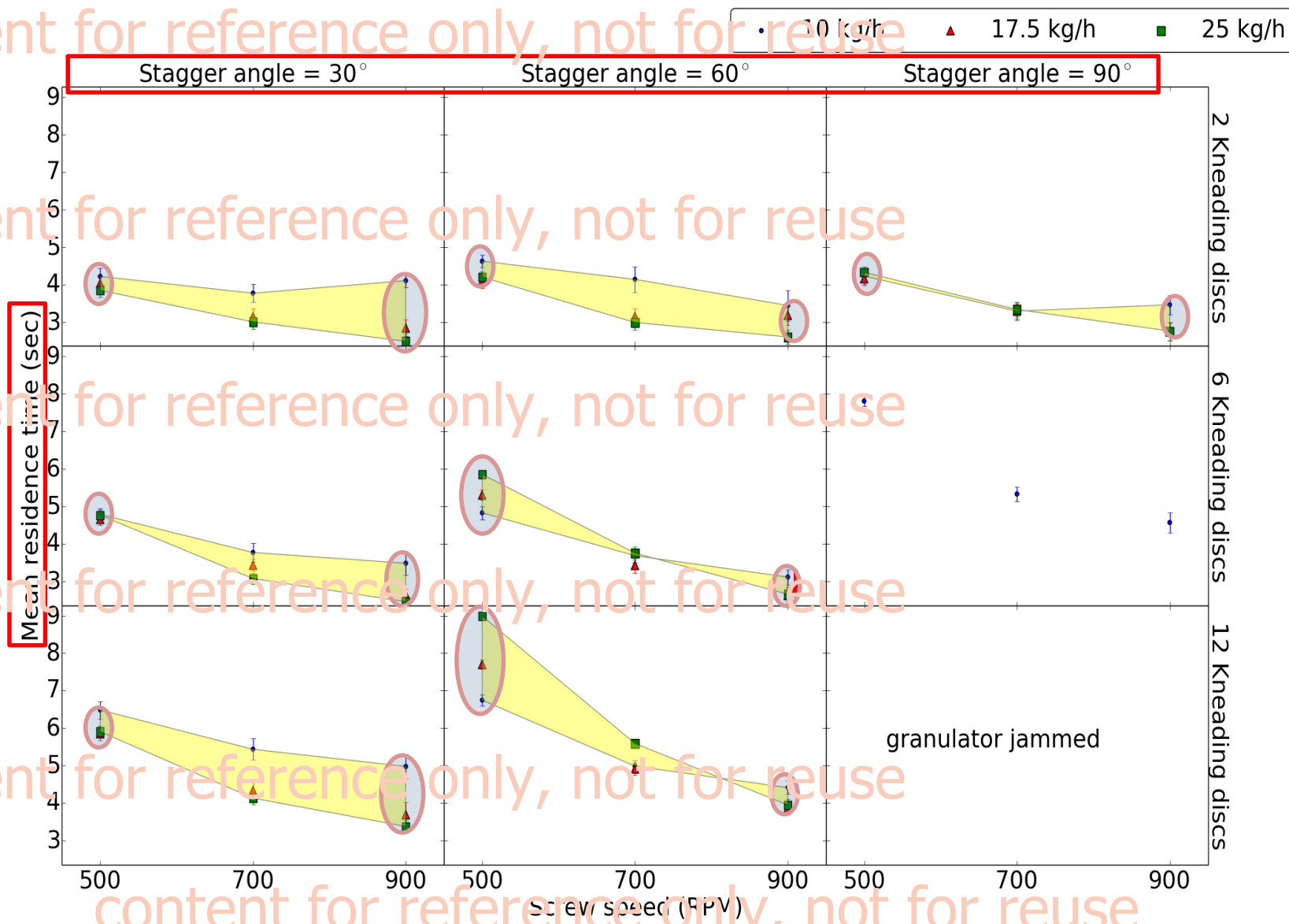
# Residence time reduces with increase in throughput...but not always



# Residence time increases with increase in number of kneading discs.



# Residence time reduces with increase in stagger angle.



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# Mean of the residence time distribution

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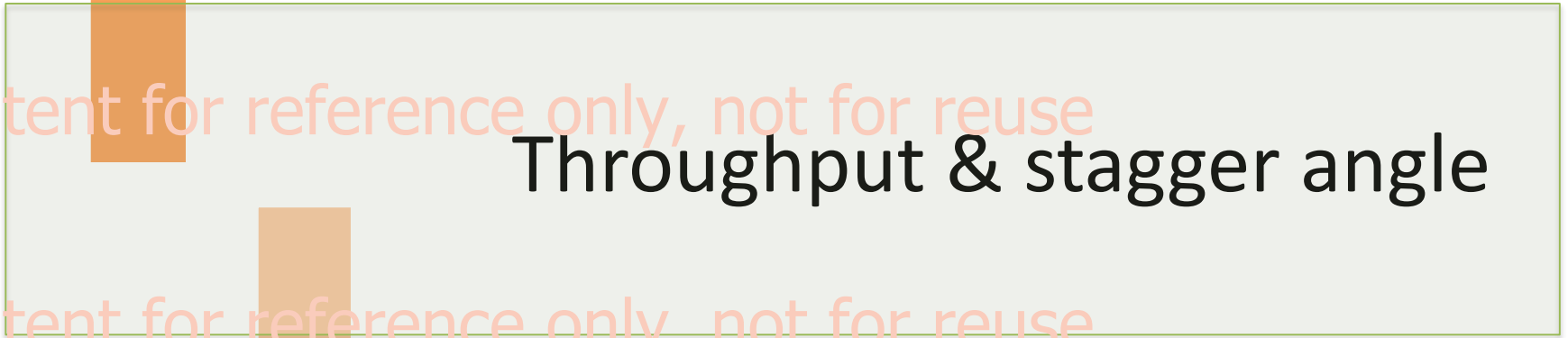


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**Number of kneading discs**

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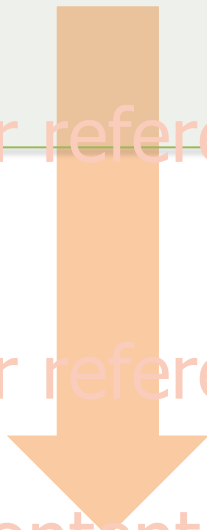
**Throughput & stagger angle**



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**Screw Speed**

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# Analysis of residence time distribution in twin-screw granulation

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Chemical imaging based RTD measurement

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Model Formulation

## Outcomes

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- Measurement based {
- Mean residence time
  - **Mean centred variance**

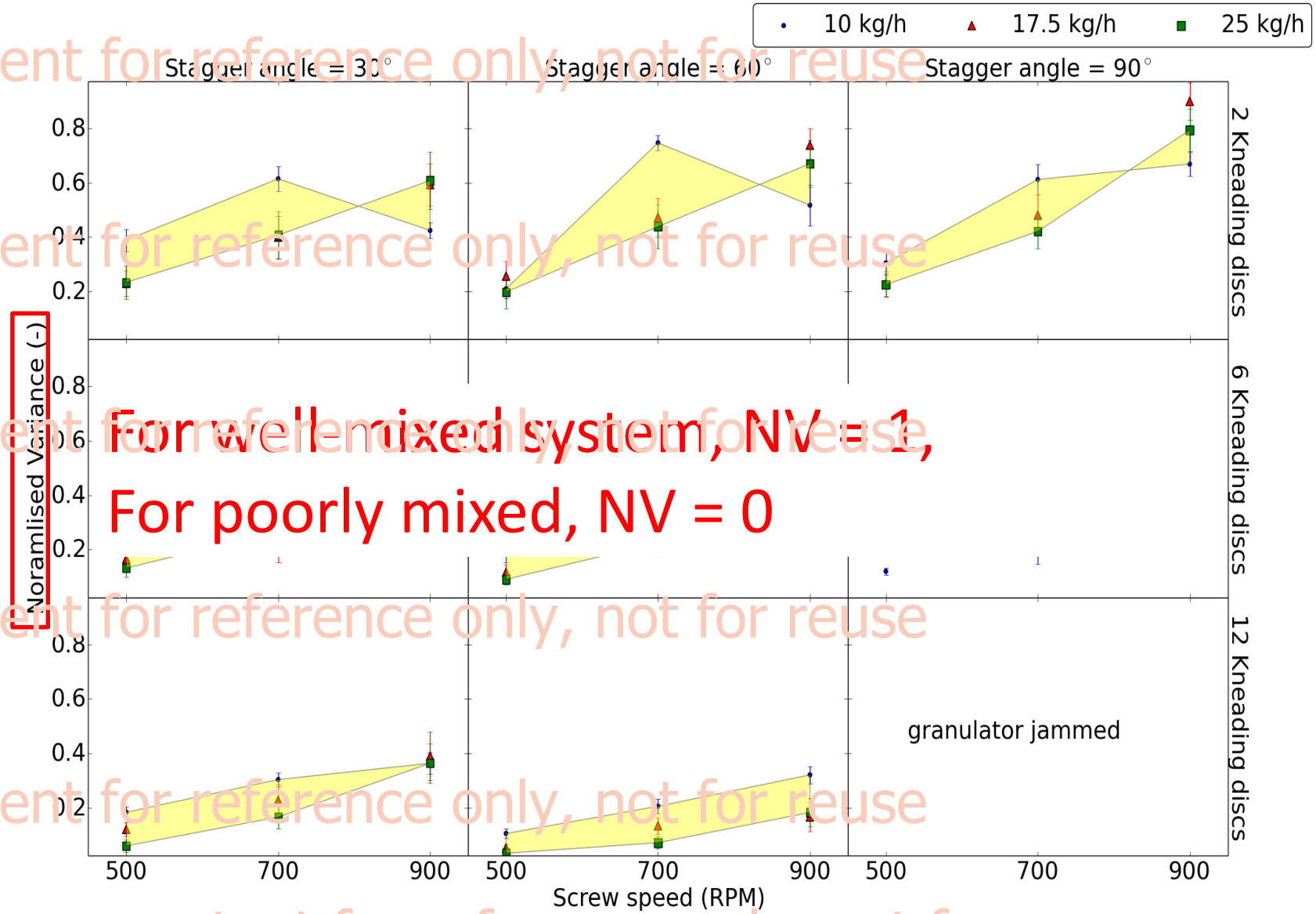
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- Model based {
- Number of CSTR
  - Plug flow fraction
  - Dead volume fraction

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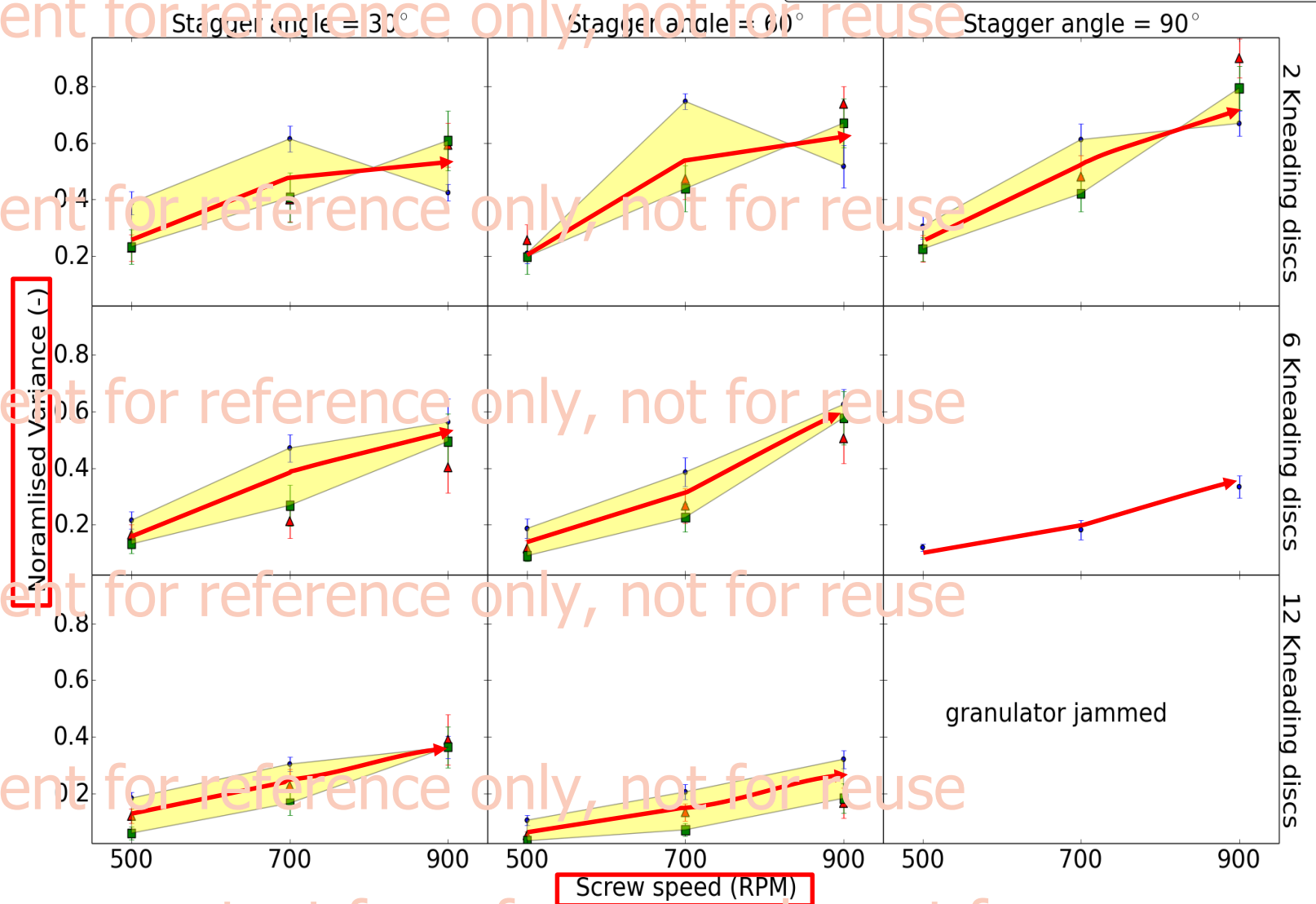
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# Width of the distribution shows axial mixing



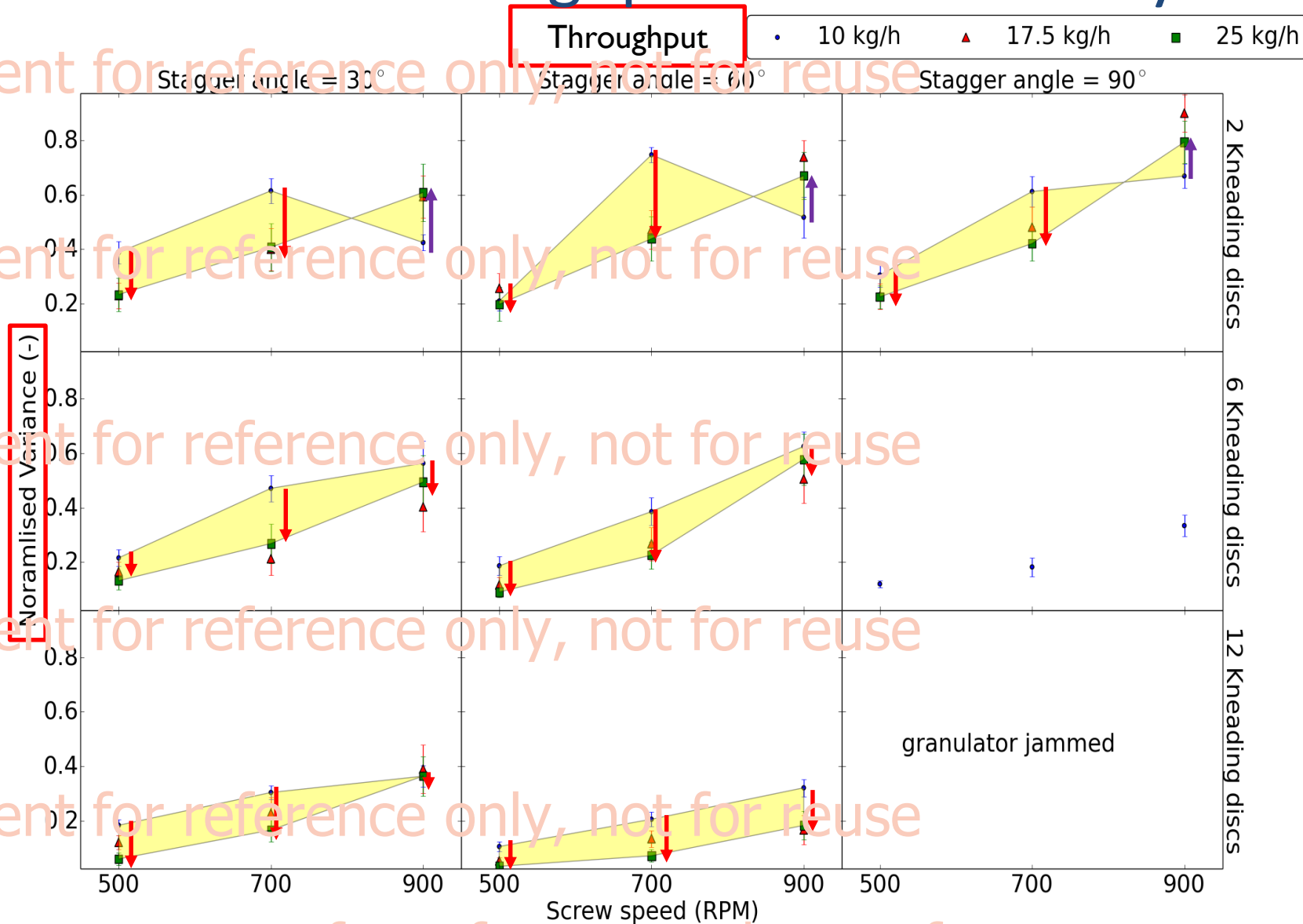
# Axial mixing increases with increase in screw speed

• 10 kg/h    ▲ 17.5 kg/h    ■ 25 kg/h



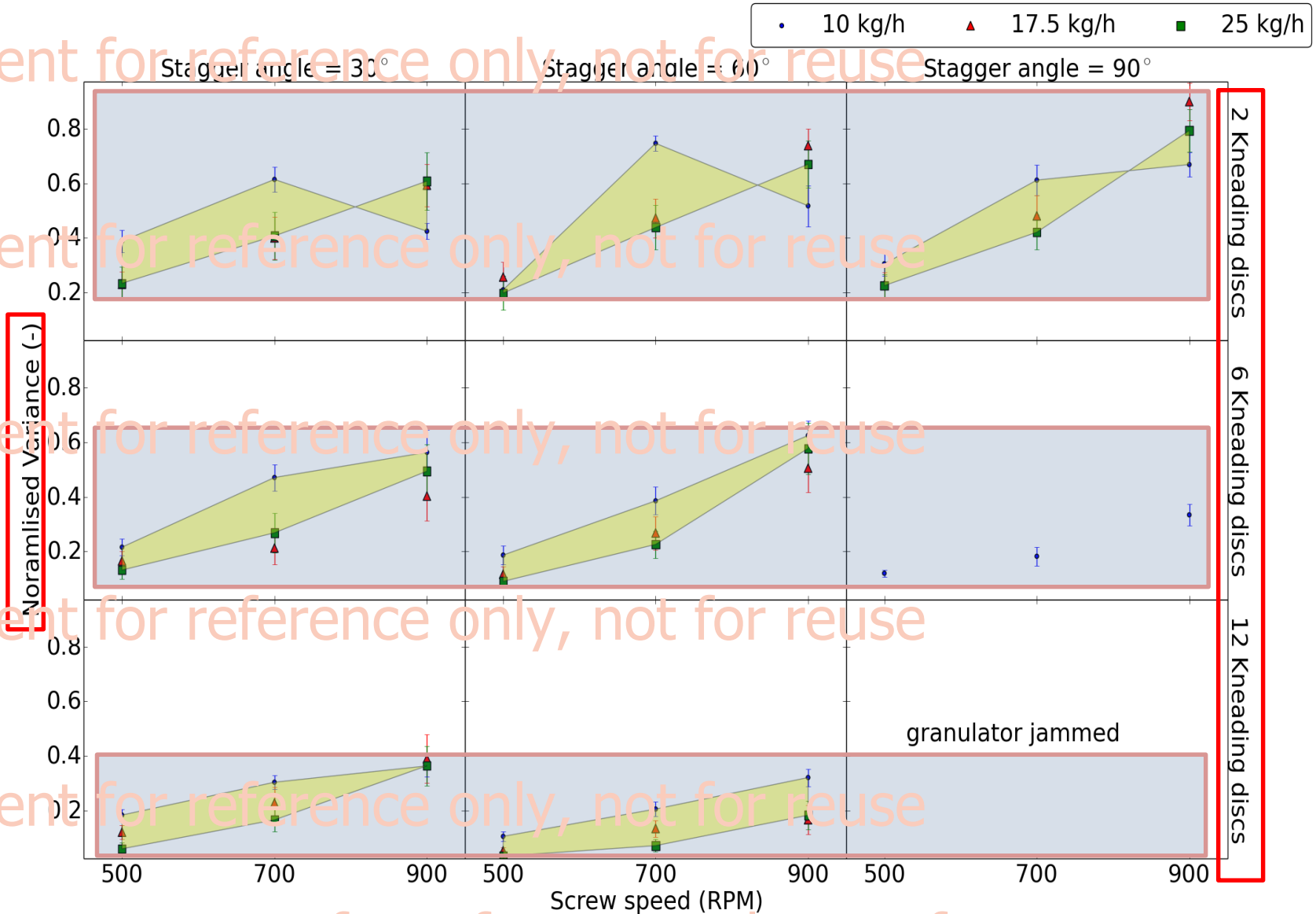


# Axial mixing increases with increase in throughput...but not always

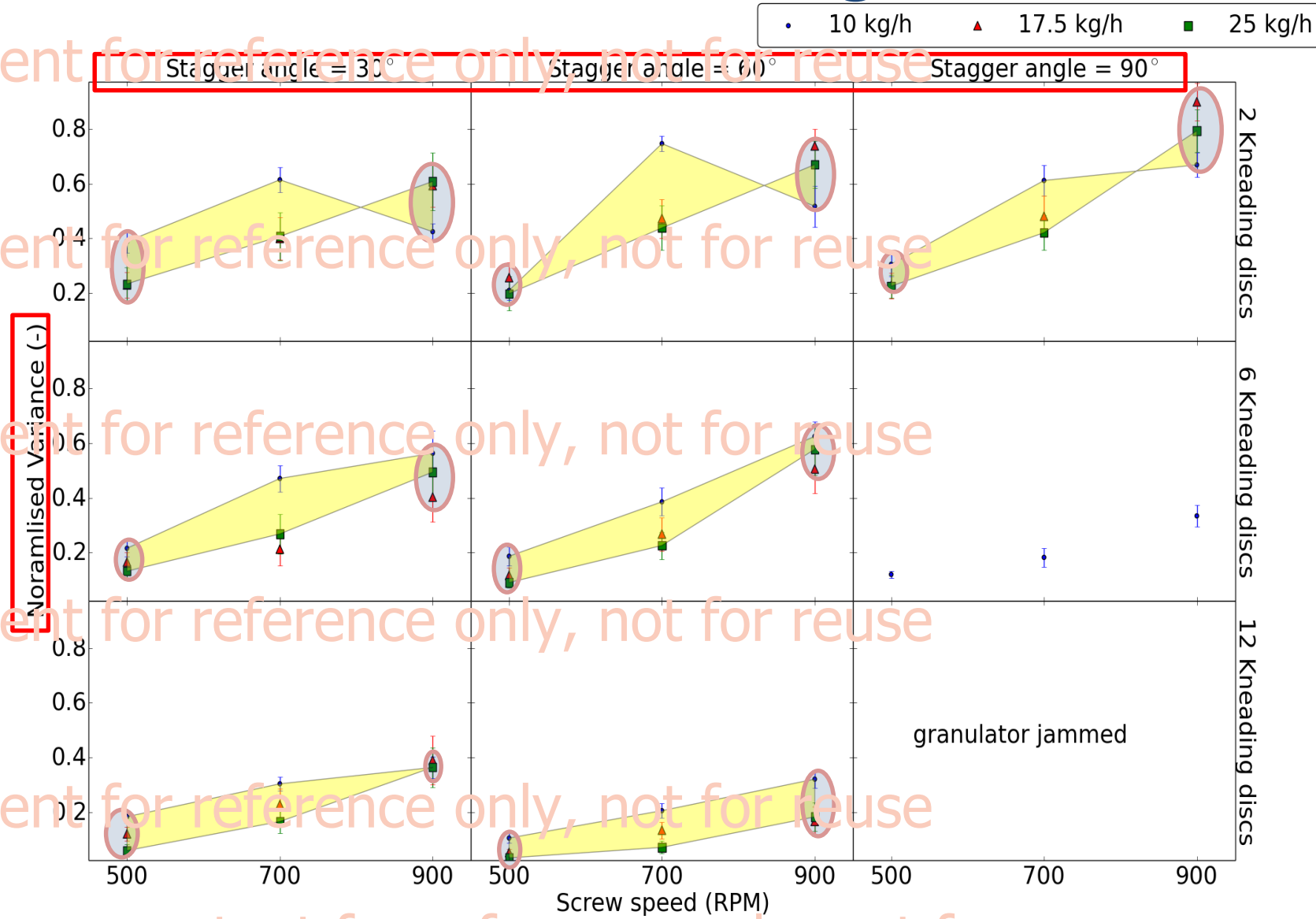


For well-mixed system, NV = 1, For poorly mixed, NV = 0

# Axial mixing decreases with increase in number of kneading discs



# Increase in stagger angle caused reduction in axial mixing



For well-mixed system, NV = 1, For poorly mixed, NV = 0

# Major factors had opposite effects on residence time and axial mixing

Factors	Residence time	Axial Mixing
Number of kneading discs	Increase	Decrease
Screw Speed	Decrease	Increase
Throughput	Interaction	Interaction
Stagger angle	interaction	Interaction

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# Analysis of residence time distribution in twin-screw granulation

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Chemical imaging based RTD measurement

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Model Formulation

## Outcomes

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- Measurement based {
- Mean residence time
  - Mean centred variance

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- Model based {
- Number of CSTR
  - Plug flow fraction
  - Dead volume fraction

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# Parameters of the TIS model estimated

using experimental RTD based on least SSE

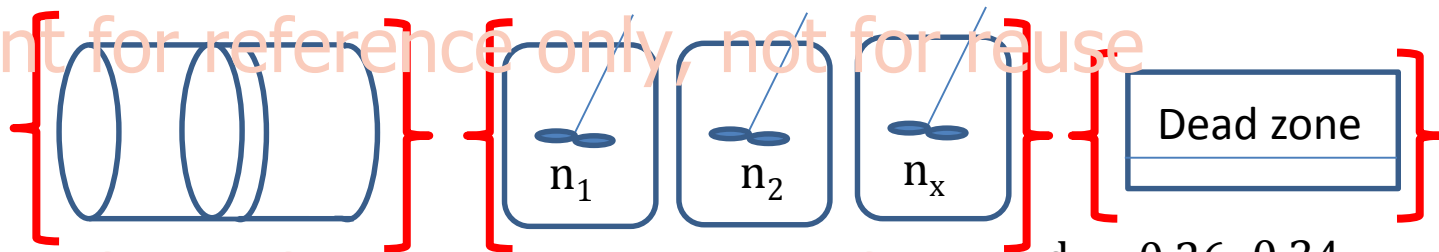
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$$e(\theta) = \frac{b[b(\theta - p)]^{n-1}}{(n-1)!} e^{-b(\theta-p)}$$

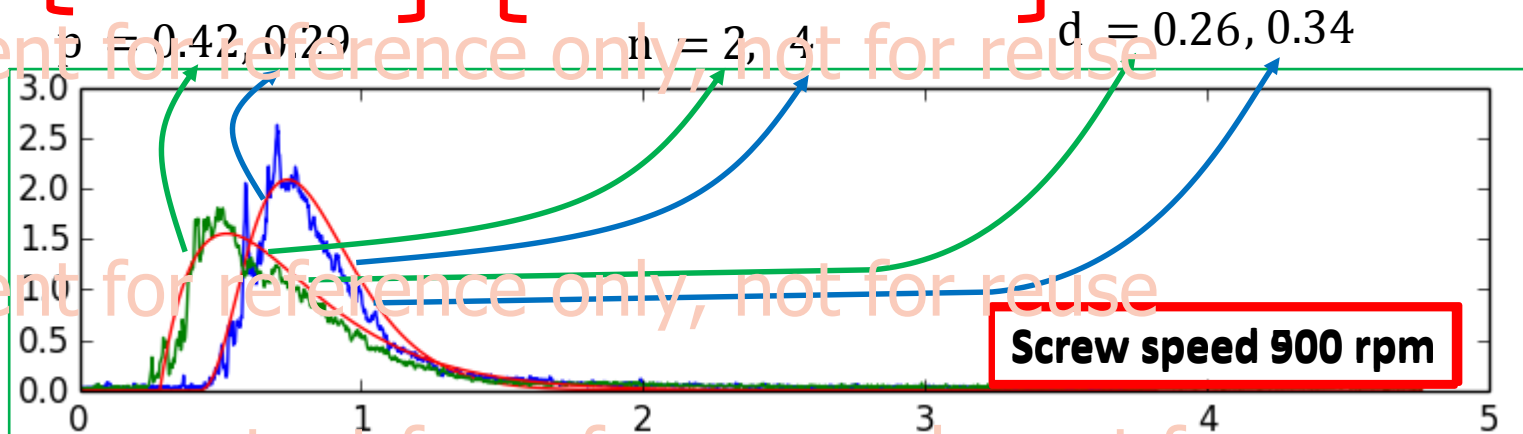
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$$\text{where, } b = \frac{n}{(1-p)(1-d)}$$

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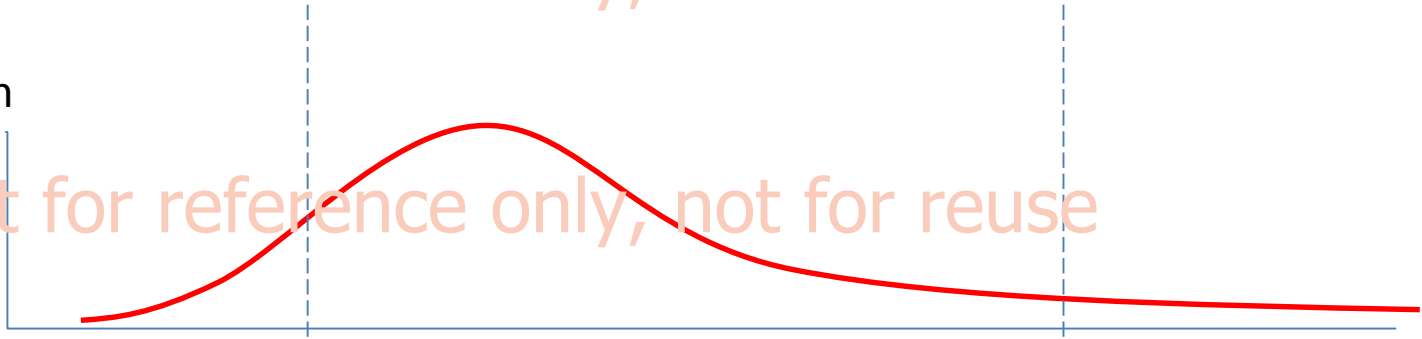
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# Plug flow component of the RTD

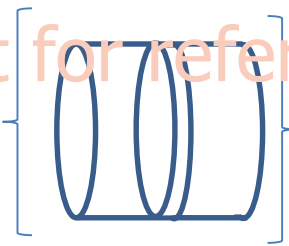
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Tracer  
addition

$e(t)$



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# Plug flow fraction decreases with increase

in screw speed and throughput

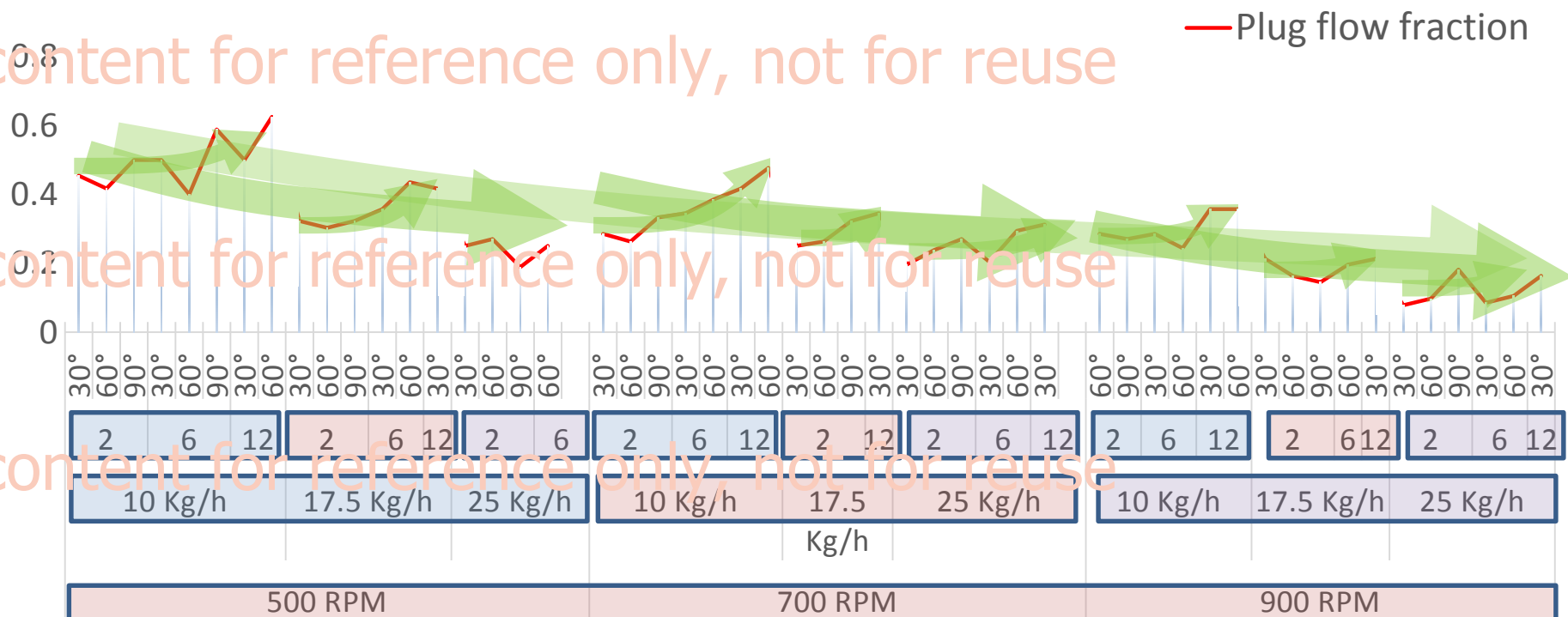
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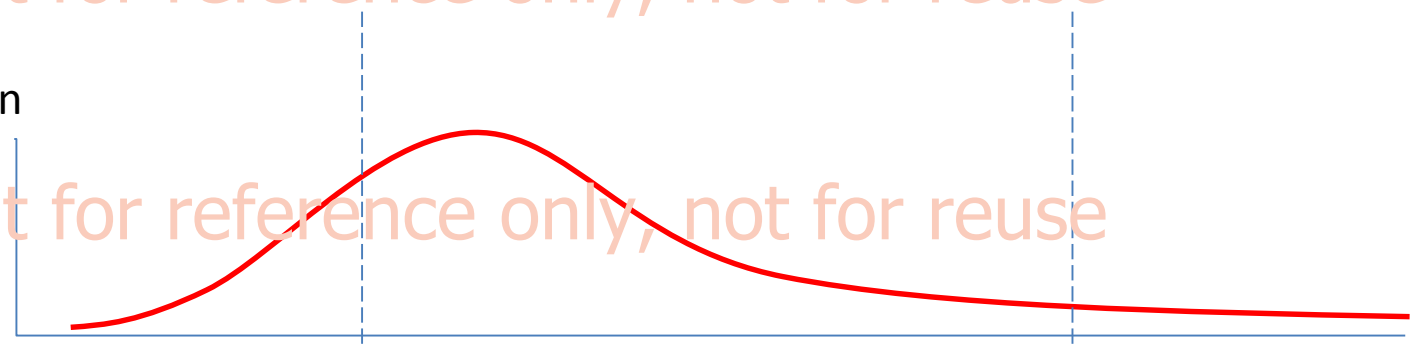
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# Mixed flow component of the RTD

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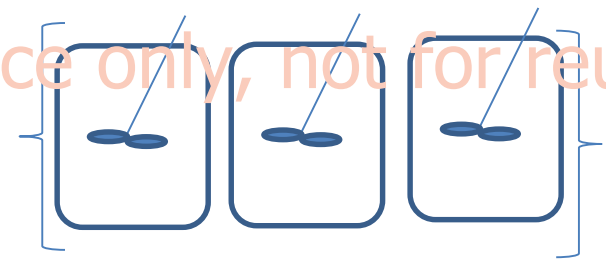
Tracer  
addition

$e(t)$



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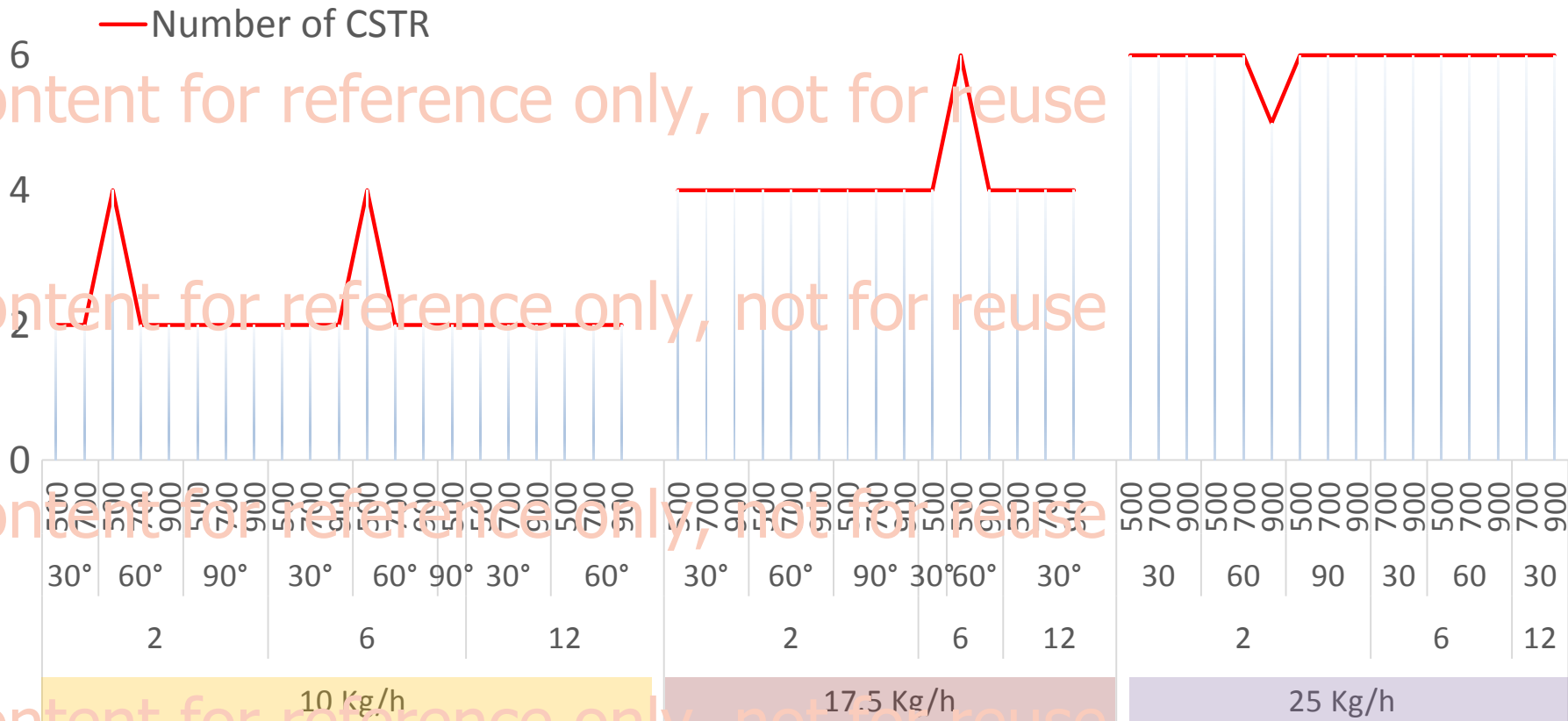


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# Material throughput controls mixing which reduces with increase in throughput



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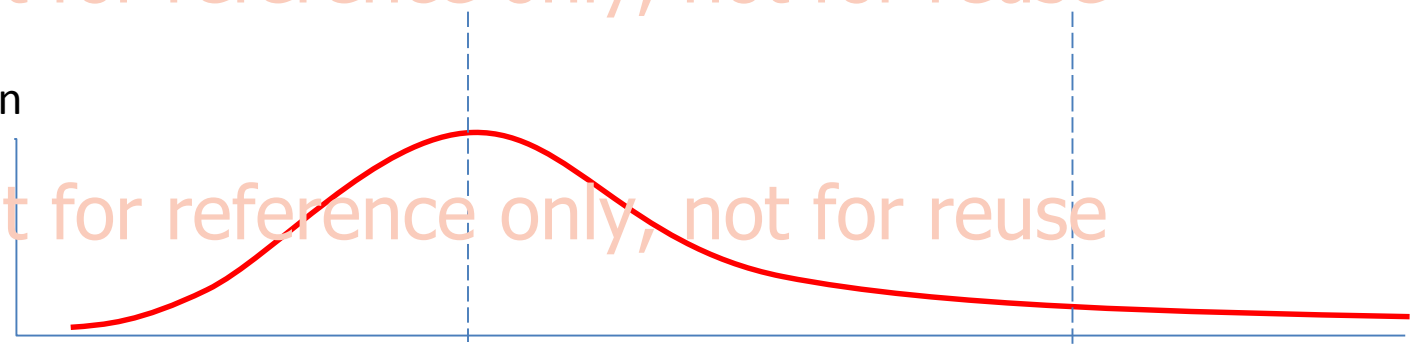
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# Mixed flow component of the RTD

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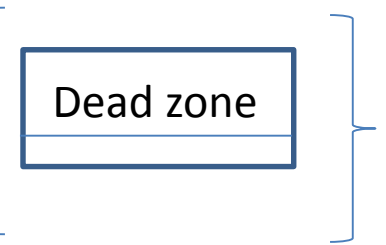
Tracer  
addition

$e(t)$



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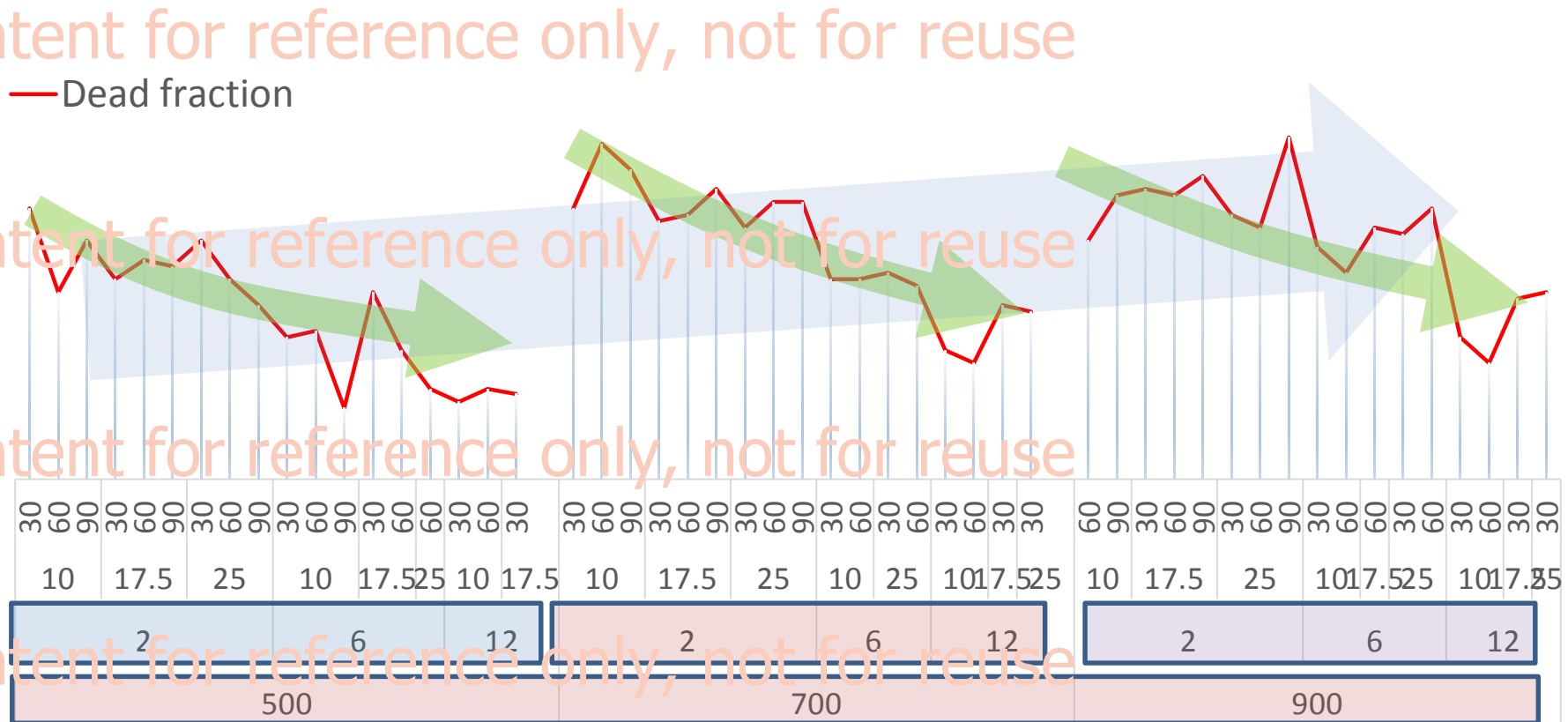


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# Dead zone increases with screw speed, and reduces with increase in kneading discs



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## Model based analysis showed that

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Screw speed reduces the conveying fraction

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Material throughput dictates mixing.

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Number of kneading discs help to reduce the

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dead volume in TSG

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# Conclusions

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NMR-based chemical imaging is fast and robust technique for RTD studies.

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Along with experimental study, an improved insight by model based analysis of RTD.

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Screw speed controls the residence time, while the material throughput controls mixing.

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# Perspectives

Together with a Granule size distribution study it will be confirmed **which mixing regime is most desirable.**

In further study **we will investigate material properties influence** on the RTD and mixing.

Utilise the mixing and residence time information for **mechanistic modeling of the TSG.**

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Thomas De Beer

Ingmar Nopens

Krist V. Gernaey



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Jurgen Vercruysse

Valérie Vanhoorne

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Maunu Toiviainen

Panouillot Pierre-Emmanuel



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Mikko Juuti

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Kris Schoeters



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Laboratory of Pharmaceutical Process Analytical Technology

**BIOMATH**

Model-based analysis and optimization of bioprocesses

Ashish.Kumar@UGent.be