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Experimental investigation of granule size and shape dynamics in twin-screw granulation

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1 **Abstract**

2 A twin-screw granulator (TSG), a promising equipment for continuous high shear wet
3 granulation (HSWG), achieves the desired level of mixing by a combination of the appro-
4 priate screw configuration and a suitable set of process settings (e.g. feed rate, screw speed,
5 etc.), thus producing a certain granule size and shape distribution (GSSD). However, the pri-
6 mary sizing and shaping mechanism behind the resulting distribution is not well understood
7 due to the opacity of the multiphase system in the granulator. This study experimen-
8 tally characterised the GSSD dynamics along the TSG barrel length in order to understand
9 the function of individual screw modules and process settings, as well as their interaction.
10 Particle size analysis of granules collected at the outlet of the TSG suggested significant
11 interaction between the process and screw configuration parameters influencing the hetero-
12 geneity in the GSSD. By characterising the samples collected along the screw length, a
13 variable influence of the screw modules at different process conditions was observed. At low
14 liquid-to-solid ratio (L/S), the first kneading module seemed to play a significant role in
15 mixing, whereas the second kneading module was found to be more involved in reshaping
16 the granules. At high L/S and high throughput, aggregation mainly took place in the second
17 kneading module changing the GSSD. The results obtained from this study will be further
18 used for the calibration and validation of a mechanistic model and, hence, support future
19 development of a more detailed understanding of the HSWG process in a TSG.

20

21 *Keywords:* twin-screw granulation, continuous pharmaceutical production, granule size and
22 shape analysis

23 1. Introduction

24 Granulation is a process aiming at enlarging powder particles, which can be advantageous
25 for many reasons. The size enlargement results in gravity forces exceeding the van der Waals
26 forces, thereby contributing to better flow properties required for improved processability
27 and accurate dosing in further downstream processing. Especially in the pharmaceutical
28 industry, where often highly potent drugs are processed, the amount of dust generated by
29 powder handling is reduced by granulation, resulting in improved safety. Also, segregation
30 (demixing) can be minimized along with the improved downstream processing characteristics
31 of the granules. Therefore, wet granulation is an important process for the particle enlarge-
32 ment during the formulation of solid dosage forms in the pharmaceutical industry (Ennis,
33 2010). Vervaet and Remon (2005) extensively reviewed continuous granulation techniques.
34 The high shear twin-screw granulation system has received most attention in the last decades
35 due to its inherent benefits, including ease of use in continuous operation and the potential to
36 integrate the TSG with other operations (Kumar et al., 2013). The high shear wet granula-
37 tion (HSWG) process in the twin-screw granulator (TSG) can be divided into several stages
38 (Fig. 1). A number of different mechanisms, including nucleation, growth, aggregation, and
39 breakage, which ultimately determine the characteristics of the produced granules, typi-
40 cally drive the dynamics of wet granulation. Although details about the precise sequence of
41 growth and breakage mechanisms during TSG are not available from the literature, growth
42 and breakage of granules are expected to occur simultaneously due to the inhomogeneous
43 shear force distribution inside the TSG barrel (Dhenge et al., 2012).

44 [Figure 1 about here.]

45 Normally in batch HSWG the granulation time is in the order of minutes, while, in a
46 TSG, it is limited to a few seconds (Kumar et al., 2014). The short granulation time is,
47 although desirable from the productivity point of view, challenging for micro to meso scale
48 rate processes in HSWG (Fig. 1). The rate processes of wet granulation are required to
49 occur during the short granulation time before the material leaves the TSG. Thus, besides

50 a homogeneous distribution of granulation liquid and powder, the wet mixing in a TSG is
51 also required to be achieved within the shortest possible screw length and with minimum
52 power input. To facilitate wet granulation, the TSG screw is composed of mainly two
53 blocks (Fig. 2). The first and the larger component contains the inter-meshing conveying
54 elements involved in transport of the dry and then wetted powder. The second component
55 is the mixing section, which contains kneading discs staggered at a certain angle to cause
56 restriction to the flow and hence provide the required mixing for wet granulation. These
57 modules change the shear environment of the material being conveyed, which determines
58 the final granule characteristic distribution, such as granule size and shape distribution
59 (GSSD), granule strength, etc. (Djuric et al., 2009). Besides the functional role of the screw
60 configuration, performance of a TSG is also related to the applied process parameters. Along
61 with the screw speed and the screw configuration, the feeding rate of the powder and the
62 granulation liquid which together determine the liquid-to-solid ratio (L/S), and the fill ratio
63 inside the barrel are the main process parameters. Therefore, they can be independently
64 chosen to achieve the desired mixing levels of the powder and the granulation liquid, and
65 influence the granulation yield at the outlet (Vercruyssen et al., 2012, 2013).

66 [Figure 2 about here.]

67 However, there is very little understanding regarding the primary shaping mechanisms
68 behind the particle size and shape distribution in the TSG during wet granulation, due to
69 the opacity of the multiphase system (Dhenge et al., 2012; El Hagrassy and Litster, 2013).
70 Most of the studies rely on the characterisation of the granules from the outlet of the TSG.
71 Furthermore, the measured torque of the granulator drive is used as the steady state criterion
72 in most studies using TSG. However, torque being a 0-dimensional measurement does not
73 provide information linking the role of change in process parameters to the role of individual
74 screw elements in the TSG.

75 This study extends the spatial dimension of knowledge regarding HSWG using TSG in
76 order to understand the dynamic change in characteristics of the material while progressing
77 in the TSG barrel. The purpose of this study was to experimentally characterise the change

78 in GSSD along the TSG barrel in order to understand the function of individual screw
79 modules and their interaction with other process parameters such as L/S, screw speed and
80 filling degree in the TSG.

81 **2. Materials and methods**

82 *2.1. Pharmaceutical model formulation*

83 In this study, a premix of α -Lactose monohydrate (Pharmatose 200M, Caldic, Hemiksem,
84 Belgium) and Polyvinylpyrrolidone (PVP) (Kollidon[®] 30, BASF, Ludwigshafen, Germany)
85 (ratio: 97.5/2.5, w/w) was granulated with distilled water using the ConsiGma-1 continuous
86 wet granulation system.

87 *2.2. Continuous twin screw granulation*

88 Granulation experiments were performed using a 25 mm diameter co-rotating TSG with
89 option to open the barrel, which is the granulation module of the ConsiGma-1 unit (GEA
90 Pharma Systems, Collette[™], Wommelgem, Belgium). The granulator screws had a length-
91 to-diameter ratio of 20:1 (Fig. 2). The screw configurations up to 6 kneading discs (Length
92 = Diameter/4 for each kneading disc) were composed of one kneading block. For the screw
93 configuration with 12 kneading discs, two kneading blocks each consisting of 6 kneading
94 discs were used. Both kneading zones were separated by a conveying screw block (Length
95 = 1.5 Diameter). The stagger angle of the kneading elements was fixed at 60°. An extra
96 conveying element (Length = 1.5 Diameter) was implemented after the second kneading
97 block together with 2 narrow kneading discs ($L = D/6$ for each kneading disc) in order to
98 reduce the amount of oversized agglomerates, as reported by Van Melkebeke et al. (2008).
99 The barrel jacket temperature was set at 25°C. The TSG barrel had a feed segment, where
100 the powder entered the barrel and was transported through the conveying zone to the work
101 segment, where the granulation liquid was added to the powder (Fig. 2) (Fonteyne et al.,
102 2012; Vercruyssen et al., 2012). During processing, the powder premix was gravimetrically fed
103 into granulator by using a twin concave screw feeder with agitator (DDW-MD2-DDSR20,
104 Brabender, Duisburg, Germany). Distilled water as granulation liquid was pumped into

105 the screw chamber using a peristaltic pump (Watson Marlow, Cornwall, UK) using silicon
106 tubings connected to 1.6 mm nozzles. The granulation liquid was added before the first
107 kneading disc by dripping through two liquid feed ports, each port located just above each
108 screw in the barrel. The wetted, but not yet mixed powder was forced to follow a granula-
109 tion track composed of the two co-rotating screws with a number of transport and mixing
110 modules based on screw configuration. As the wet powder progresses along the length of
111 the granulator, the distribution of particle characteristics changes.

112 *2.3. Experimental design and sample preparation*

113 A full factorial experimental design was performed to evaluate the influence of number
114 of kneading discs (2, 4, 6, 12), screw speed (500-900 rpm), throughput (10-25 kg/h) and
115 L/S (4.58-6.72% (w/w) based on wet mass) (Table 1). Three center point experiments
116 were performed as well, resulting in $32 + 3 = 35$ experiments. For each run, samples
117 were collected from different locations inside the barrel by opening the barrel after stopping
118 the process running at steady state (Fig. 2). Sample location 1 was just prior to the first
119 kneading block, sample location 2 on the first kneading block, sample location 3 was between
120 the first and second kneading block, sample locations 4 and 5 were on and right after the
121 second kneading block. Irrespective of the number of kneading blocks, sample locations on
122 the screw were kept constant during sampling. Sample location 6 was the regular outlet
123 of the granulator and, hence, a large amount of granules was available at that location.
124 The wet granules from all the experiments were dried at room temperature for 24 h and
125 their GSSD was classified in granules size fractions <150 , between 150-1000 and >1000
126 μm (Table 1). The particle size distribution of α -Lactose monohydrate used for this study
127 was 90% not more than 100 μm and 100% not more than 200 μm . Therefore <150 micron was
128 defined as fine to prevent under-prediction of fines. Since several responses were measured,
129 it was helpful to fit a model simultaneously representing the variation of all responses to
130 the variation of the factors. Therefore, the partial least squares (PLS) method was used
131 (employing Modde 9.0 software by Umetrics, Umeå, Sweden), which is able to deal with
132 many responses simultaneously, accounting for their covariances. The effect plot was used

133 to show the change in the response when a factor vary from low to high level, keeping other
134 factors at their averages. The respective 95% confidence interval is shown for each plot.
135 Insignificant effects are those where the confidence interval includes zero. The effects in this
136 plot are ranked from the largest to the smallest.

137 [Table 1 about here.]

138 *2.4. Determination of torque*

139 The TSG has an inbuilt torque gauge and the achievement of steady-state was decided
140 based on the equilibration of the measured torque of the granulator. The torque values
141 obtained after equilibration of the process were averaged to give the overall torque at steady-
142 state during each run. The drive motor torque values are an indication of the shear and
143 consolidation forces experienced by materials inside the barrel.

144 *2.5. Characterisation of granules*

145 *2.5.1. Sieve test for particle size analysis*

146 The granule size distribution (GSD) of the granule samples, collected at the outlet of the
147 TSG (sample location 6 in Fig. 2) during each design experiment, was determined using the
148 sieve analysis method (Retsch VE 1000 sieve shaker (Haan, Germany)). Granule samples
149 (100 g) were placed on a shaker for 5 min at an amplitude of 2 mm using a series of sieves
150 (150, 250, 500, 710, 1000, 1400 and 2000 μm). The amount of granules retained on each
151 sieve was determined. All granule batches were measured in triplicate. The fractions <150,
152 150-1000 and >1000 μm were defined as the amount of fines, fraction of interest for tableting
153 and oversized fraction, respectively.

154 *2.5.2. Dynamic image analysis for size and shape analysis of granules*

155 The GSSD of the samples from sampling locations which were inside the TSG barrel
156 (Fig. 2), were determined via dynamic image analysis (DIA) used in the EyeTech instrument
157 (Ankersmid B.V., Oosterhout, The Netherlands). A high speed camera (Fig. 3a) records
158 pictures (up to 30 pictures /sec) and visualises the particle distribution in real time during

159 the measurement. The camera was synchronized with a pulsing light emitting diode (LED)
160 and takes backlighted images. The captured images of flowing powders were used to calculate
161 GSSD.

162 The average Feret diameter was used as the size parameter that provides information
163 on a diameter that is measured every 5 degrees, resulting in an average of a total of 36
164 diameters for each granule (Fig. 3b, eq. 1). This size information also serves as a basis for
165 the calculation of shape related parameters such as the aspect ratio, which measures the
166 elongation of the granule and has been used in this study. It is a ratio of the smallest over
167 the largest diameter of the granule (eq. 2). The aspect ratio gives information about how
168 far the particles deviate from being spherical. Rod shaped particles have an aspect ratio
169 less than 0.5 while an aspect ratio close to 1 indicates higher sphericity of the granules.

$$\text{Feret Diameter} = \frac{d_1 + d_2 + d_3 + d_4 \dots d_{36}}{36} \quad (1)$$

$$\text{Aspect ratio} = \frac{\text{Minimum Feret Diameter}}{\text{Maximum Feret Diameter}} \quad (2)$$

170 [Figure 3 about here.]

171 The link between mean Feret diameter and aspect ratio of the granules was determined
172 simultaneously by the WINDOX software using Sympatec Image Analysis (QICPIC) (with
173 the same measurement system as the Eyetech) by dispersing the granules under gravity
174 through the focus plane of a high speed camera.

175 The screw arrangement at sample locations 2 and 4 was changed based on the experi-
176 mental design, which lead to a deviation in granule characteristics at these locations purely
177 due to the local and experimental run specific conditions. Therefore, they have not been
178 used in the remainder of this study and the samples from location 1, 3 and 5 in Fig. 2 were
179 analysed for further study.

180 3. Results and discussion

181 This study examined the impact of four main factors of HSWG using TSG, which include
182 the screw speed, number of kneading discs, throughput and L/S during granulation on the
183 GSSD.

184 3.1. Influence of process variables on the granules at the outlet

185 The samples collected at the outlet of the TSG (sample location 6 in Fig. 2) were analysed
186 using a sieve test for each experiment. This was useful to understand the effect of the various
187 factors on the granule size fractions (F) defined as fines ($F < 150 \mu\text{m}$), fraction of interest
188 for tableting ($150 \mu\text{m} < F < 1000 \mu\text{m}$) being the granulation yield, oversized granules (F
189 $> 1000 \mu\text{m}$) as well as the measured torque (Nm) (Table 1). The effect of individual factors
190 and their combinations on size fractions determined via the PLS method, suggested that
191 the L/S had a significant effect on both the fines (16.10–45.87% $< 150 \mu\text{m}$) and oversized
192 fraction (15.21–49.43% $> 1000 \mu\text{m}$) of the granules (Fig. 4, Table 1). From this analysis,
193 it was observed that granules contained a higher fraction of fines when the powder was less
194 wetted at low L/S and vice versa produced more oversized granules. Since the parameters
195 having a positive effect on the oversized fraction had a negative effect on the fines and
196 vice versa, these parameters did not affect the yield of the fraction of interest significantly
197 (yield between 31.01 - 55.90%). Furthermore, low screw speeds resulted in an increase of
198 the oversized fraction, due to material accumulation at a reduced conveying rate and the
199 lack of proper sheared mixing and less breakage inside the barrel. For the oversized fraction,
200 the interaction between L/S and number of kneading discs was significant as the effect of
201 the change in L/S was observed to be different at a low or high number of kneading discs.
202 At a higher number of kneading discs, L/S variations caused more drastic changes in the
203 oversized fraction compared to similar L/S variations for a low number of kneading elements.

204 The measured torque of the granulator drive, which is related to the fill level and the shear
205 mixing of material in the TSG, was found to be most affected by the number of kneading
206 discs. The increase in the number of kneading discs caused an enhanced hindrance to the
207 flow of material and hence a high torque of the granulator drive. However, this hindrance

208 to the flow in the screw channel resulted in a greater residence time and more distributive
209 mixing of the powder which is essentially required for a better granulation yield (El Hagrasy
210 and Litster, 2013). Also, the interaction between the number of kneading elements and
211 screw speed was significant with respect to the torque. The torque increase from 2 to 12
212 kneading elements was higher at a low screw speed compared to that at a high screw speed.
213 This could be explained by the higher filling degree of the barrel at low screw speed.

214 [Figure 4 about here.]

215 *3.2. Influence of process variables on granule properties along the TSG length*

216 The samples from location 1 (before the first kneading block), location 3 (after the first
217 kneading block) and location 5 (after the second kneading block in the screw configuration
218 with 2 kneading blocks) were used to characterise the change in the GSSD along the TSG
219 length (Fig. 2). Firstly, it is important to point out that the granulation using only 2
220 kneading discs did not yield a sufficient degree of control over the process, and therefore the
221 results were inconsistent (data not shown). We believe that 2 kneading discs in the screw
222 configuration pose a too low hindrance to the flow in the screw channel. Due to this, the
223 primary response by the kneading block in terms of restriction to the flow was significantly
224 asynchronous, thus generating random results. Therefore, for further comparison only results
225 from runs with 4, 6 and 12 kneading discs are presented. The pattern of evolution in
226 granule size and shape indicates that the formation of primary granules (50-200 μm) led
227 to a loss in the particle shape uniformity via reduction in the aspect ratio (Fig. 5). The
228 further growth of granule size (between 200-400 μm) resulted in a more uniform and higher
229 mean aspect ratio. However, an increase in granule size beyond 400 μm led to a more
230 heterogeneous and relatively lower aspect ratio. For the three sample locations (1, 3 and 5)
231 in Fig. 2 it was observed that granules at location 1 (top subplot in Fig. 5) had a reasonably
232 homogeneous aspect ratio except for the oversized granules. As the granules moved to sample
233 location 3 (middle subplot in Fig. 5) both primary (50-200 μm) and oversized granules were
234 further deformed. Compared to location 3, there was a minor increase in the width of the
235 intermediate size granules (between 200-800 μm) at sample location 5 (bottom subplot in

236 Fig. 5) with a more uniform aspect ratio. However, the larger granules remained deformed.
237 This can be explained by the high shear and the lack of free space inside the TSG which
238 is very different from high-shear mixers where granules, despite their large sizes, tumble on
239 their free surface and get rounded (Lee et al., 2013).

240 [Figure 5 about here.]

241 Furthermore, as the wetted powder is conveyed from the pre-kneading zone to the first
242 kneading zone and further, the number density of the granules shifted towards the right,
243 indicating an increase in the fraction of larger granules and occasionally some breakup at the
244 end (Fig. 6 and 8). Remarkably, an increasing number of kneading discs not only increased
245 the fraction of larger granules for the downstream sample locations 3 and 5 which were
246 located after the kneading blocks but also at sample location 1, which was located upstream
247 of the kneading discs. This suggests that along with the mixing section composed of kneading
248 discs, a significant mixing and granulation also occurs in the upstream section. The material
249 in the mixing section flows more slowly than in the upstream section and hence the built-up
250 material in the flow restricted zone of the barrel is force-mixed with the incoming materials.
251 Lee et al. (2012) have shown that the degree of filling of the 'non-kneading zone' of the
252 granulator increases with an increase in the restriction to the flow. Also, elongation of the
253 granules was observed to decrease along the granulator length and for increasing number
254 of kneading discs (Fig. 7 and 9). This spherification of granules together with enlargement
255 now allows discussion of the effects of factors as well as their interactions on GSSD.

256 *3.2.1. Effect of throughput*

257 *Low liquid-to-solid ratio (4.58%) and low screw speed (500 rpm)*

258 An increase in the throughput from 10 kg/h to 25 kg/h keeping the L/S and screw speed
259 at the lowest level resulted in a minor increase in the granule size for successive sample
260 locations (comparing ID 1 and 3 plots in Fig. 6). This effect was clearest for 12 kneading
261 discs, where a small reduction in the amount of fines for sample location 5 occurred. No
262 significant effect on the shape distribution was observed for configurations containing up to 6

263 kneading discs (comparing ID 1 and 3 plots in Fig. 7). For a higher number of kneading discs
264 the elongation of the granules decreased with the progressive sample locations indicating a
265 greater consolidation of granules.

266 *High liquid-to-solid ratio (6.72%) and low screw speed (500 rpm)*

267 At high L/S more granulation liquid enhanced the size enlargement rate processes (such
268 as wetting, nucleation and aggregation), and thereby a shift of GSDs towards higher average
269 diameters was noticed (ID 2 and 4 plots in Fig. 6). For up to 6 kneading discs, increased
270 throughput had a trivial influence on granulation, which was reflected by the fact that no
271 change in the GSD was observed. However, a further granule size enlargement at location
272 5 and a broadening of the distribution were observed when the second kneading block was
273 present (comparing ID 2 and 4 plots for 12 kneading discs in Fig. 6). Besides the size,
274 increasing throughput at a high number of kneading discs affected the aspect ratio profile,
275 which shifted towards the right and became narrower for location 3 (ID 2 and 4 plots in
276 Fig. 7). However, the higher fill ratio at increased throughput and sluggish flow of more
277 wetted powder in the granulator barrel led to an almost doubled TSG drive torque (ID 4
278 plots in Fig. 6).

279 [Figure 6 about here.]

280 *Low liquid-to-solid ratio (4.58%) and high screw speed (900 rpm)*

281 Despite good shear mixing at high screw speed, increasing the throughput did not support
282 an increase in the fraction of larger granules due to a low L/S (ID 1 and 3 plots in Fig. 8).
283 The increased throughput for the 12 kneading discs configuration showed a reduction in the
284 larger granules after the second kneading block (location 3 and 5 profiles when comparing
285 ID 1 and 3 plots for 12 kneading discs in Fig. 8). Besides the reduction in the granule size,
286 the increased throughput did not affect the shape of granules and the profiles for ID 1 and
287 3 plots in Fig. 9 corresponded to the same pattern for an equal number of kneading discs.

288 [Figure 7 about here.]

289 *High liquid-to-solid ratio (6.72%) and high screw speed (900 rpm)*

290 With an increase in throughput at these conditions, granulation was more uniform which
291 led to a clear difference between the GSD profile from sample location 1, 3 and 5 when two
292 kneading blocks were used (comparing ID 2 and ID 4 plots in Fig. 8). However, the GSD
293 of location 3 was narrower than at location 5 in the ID 4 plot for 12 kneading discs. The
294 increased throughput only affected the shape of the granules from location 1, where the
295 granulation liquid was distributed to a larger amount of powder available at high throughput.
296 However, due to the high shear-induced mixing at high screw speed, despite the high filling
297 ratio the downstream material was well-mixed thus yielding a more uniform particle aspect
298 ratio distribution for ID 4 plots compared to ID 2 plots in Fig. 9. However, for sample
299 locations 3 and 5 the aspect ratio profile corresponded to the same pattern for an equal
300 number of kneading discs.

301 The above suggests that increasing throughput is not beneficial without sufficient gran-
302 ulation liquid and shear mixing to make strong bridges between powder particles in the
303 agglomerates. Despite the availability of granulation liquid, when the shear-induced mix-
304 ing is poor, an inhomogeneous distribution of liquid over the material occurs resulting in a
305 broader GSD. On the other hand, at low L/S, an increase in screw speed leads to a high level
306 of shear mixing and further contributes to the fragility of the granules and thus increased
307 attrition and breakage. Although an increase in throughput requires a higher torque, this
308 issue can be solved by increasing the screw speed during granulation which increases the
309 conveying rate and reduces the load on the screws. At high shear and high L/S, the wet
310 granules are easy to deform leading to a more uniform shape. However, due to the higher
311 filling of the channels of the screws and the increased consolidation at high throughput,
312 attrition of the wet mass between the screws and barrel wall may increase, as observed
313 by Dhenge et al. (2011).

314 [Figure 8 about here.]

315 *3.2.2. Effect of liquid-to-solid ratio*

316 *Low throughput (10 kg/h) and low screw speed (500 rpm)*

317 When the L/S was increased at low levels of throughput and screw speed, the degree of
318 aggregation increased (comparing ID 1 and 2 in Fig. 6). With an increase in the number
319 of kneading discs, the measured torque and shear mixing increased and the GSD shifted
320 towards higher granule sizes at sample locations 3 and 5 (ID 2 plot in Fig. 6). However, no
321 narrowing of the size distribution at sample location 5 was observed. An additional kneading
322 block showed only a slight contribution to the aggregation when comparing the number based
323 GSD profile at sample location 3 and 5 in the ID 2 plots of Fig. 6. This also happened due
324 to the fact that bigger granules are created by aggregation of many small particles, thereby
325 resulting in a visible drop in the number of small size granules, but only a small increase
326 in the bigger ones. The increase in L/S also reduced the granule elongation for the screw
327 configurations with 6 and 12 kneading discs at sample locations 3 and 5 (comparing ID 1
328 and 2 in Fig. 7). Altogether it can be confirmed that the additional kneading block had a
329 minor contribution in this case, both in terms of granule enlargement and the spherification
330 of granules.

331 *High throughput (25 kg/h) and low screw speed (500 rpm)*

332 When the granulation was performed at high throughput and a low screw speed, an
333 increase in L/S increased the degree of aggregation (comparing ID 3 and 4 plots in Fig. 6).
334 However, the most remarkable change was observed for the screw configuration with 12
335 kneading discs when the GSD profiles of the three sample locations were clearly segregated
336 by the second kneading block in the TSG. Moreover, the aspect ratio profiles at higher L/S
337 shifted towards the right and became narrower in ID 4 compared to ID 3 plots of Fig. 7,
338 indicating an increased aspect ratio and uniformity of the granule shape. However, the
339 torque of the TSG drive increased significantly due to the high fill ratio and sluggish flow of
340 wetted powder inside the granulator barrel.

341 [Figure 9 about here.]

342 *Low throughput (10 kg/h) and high screw speed (900 rpm)*

343 With the increase in L/S at the low throughput and high screw speed, there was only a
344 minor increase in granule size for the screw configuration with 4 kneading discs (comparing
345 ID 1 and 2 plots in Fig. 8). However, increasing the number of kneading discs increased
346 the aggregation level due to which the GSD shifted towards a larger diameter. The second
347 kneading block showed only a small contribution to the aggregation level as can be observed
348 from profiles from sample locations 3 and 5 in ID 2 plots of Fig. 8. This may be due to
349 the lack of unwetted powder in the granulator to support further agglomeration. Besides,
350 the additional granulation liquid encouraged the formation of more spherical granules in
351 successive sample locations of the TSG suggesting a higher level of consolidation of the
352 granules (comparing ID 1 and 2 plots in Fig. 9). However, the shape distributions of samples
353 before and after the second kneading block were similar. This indicates that, at a very low fill
354 level, the second kneading block played a minor role in changing the shape of the granules.

355 *High throughput (25 kg/h) and high screw speed (900 rpm)*

356 At high throughput more material was available inside the TSG, but an increase in
357 screw speed caused a reduction in the fill level and improved mixing. However, at a lower
358 number of kneading discs, a considerable reduction of distributive mixing of the powder
359 and the granulation liquid and consequent aggregation occurred, leading to minor shifts
360 in GSD between locations 1, 3 and 5 (comparing ID 3 and 4 plots in Fig. 8). When the
361 number of kneading discs was increased, the wetted powder was well mixed despite a lower
362 fill level of the barrel and hence agglomerated, leading to an increase in granule size. For the
363 screw configuration with 12 kneading discs, the most significant difference between all three
364 locations was observed, which can be attributed to the presence of an additional kneading
365 block between sampling location 3 and 5 along with the one between sample location 1 and
366 3. An increase in the number of kneading discs also caused an increase in the number density
367 of high aspect ratio granules (comparing ID 3 and 4 plots in Fig. 9). Moving from a low to a
368 high number of kneading discs, for the location 1, 3 and 5 the aspect ratio distributions were
369 very similar. This indicates that shear-induced consolidation occurred in the early stage of

370 the granulation (near location 1) and the aggregation and the consolidation of the granules
371 took place simultaneously.

372 Overall, more granulation liquid at increased L/S enhances wetting, nucleation and ag-
373 gregation, i.e. granule enlargement rate processes (Litster and Ennis, 2004). However, an
374 increased L/S can only improve the agglomeration level when the mixing is also increased.
375 An increase in screw speed causes a reduction in the fill level of the wetted material and
376 an increase in the shear leading to improved mixing. Especially at high screw speed the
377 axial mixing inside the granulator increases significantly (Kumar et al., 2014). In this study,
378 a higher L/S also affected the shape of the granules along the length and the produced
379 granules grew to be more spherical. This outcome is in accordance with results reported by
380 Dhenge et al. (2012) comparing samples collected at the granulator output only. However,
381 the torque of the TSG drive increases significantly due to the high fill ratio and sluggish flow
382 of wetted powder in the granulator barrel, which can be reduced by increasing the conveying
383 rate of the screw at high screw speed.

384 *3.2.3. Effect of combined change in throughput and liquid-to-solid ratio*

385 *Low screw speed (500 rpm)*

386 When both throughput and the L/S were increased at low screw speed, there was less
387 difference between the GSD from sample locations 1 and 3 for a low number of kneading
388 discs due to the lack of mixing (comparing ID 1 and 4 plots in Fig. 6). However, a progressive
389 mixing in the axial direction occurred due to the shear induced during the conveying of the
390 wet powder, hence changing the morphology in terms of reduction in the fraction of smaller
391 granules and an increase in the fraction of larger granules at sample location 3 and 5 in
392 the ID 4 plot for 4 kneading discs in Fig. 6. For the screw configuration with 12 kneading
393 discs, most distinctly separate distributions for the three sample locations were observed.
394 However, the number density of small granules also increased with spatial progress indicating
395 that, beyond the consolidation, breakage was an important size reduction phenomenon and
396 competed with the aggregation process in the second kneading block of the TSG under these
397 conditions. Also, at a low number of kneading discs, the shape distribution of the sample

398 locations 1, 3 and 5 were similar (comparing ID 1 and ID 4 plots in Fig. 7). For an increasing
399 number of kneading discs, an increase in the aspect ratio of granules from location 3 and 5
400 caused the shape distribution of the locations 1 and 3 samples to be more distinct, while
401 the difference between locations 3 and 5 samples remained low.

402 *High screw speed (900 rpm)*

403 When the screw speed was increased, for 4 kneading discs the difference between the
404 downstream sample profiles from locations 3 and 5 was small (plot ID 4 in Fig. 8). With 6
405 kneading discs the restrictive forces started playing a role, which resulted in the formation
406 of more stable GSD even before the material entered the first kneading block (plot ID 4
407 in Fig. 8). However, in lack of adequate distributive mixing of wetted powder, there was
408 only a minor difference between sample location 3 and 5. When a second kneading block
409 was added between sampling location 3 and 5 in the screw, the powder with high moisture
410 content was distributively mixed and hence agglomerated furthermore (plot ID 4 in Fig. 8).
411 This led to GSD profiles, which were separated for all the three sample locations. Also,
412 unlike the observations at low screw speed (ID 4 plot for 12 kneading discs in Fig. 6), the
413 number density for the lower particle size did not increase with the spatial progress for high
414 screw speed indicating that sufficient mixing occurred to support the aggregation process at
415 location 5 in the TSG barrel (ID 4 plot for 12 kneading discs in Fig. 7). The suitability of
416 this condition was also reflected in the shape dynamics as the increase in number of kneading
417 discs only caused a minor increase in the aspect ratio distributions (comparing ID 1 and ID
418 4 plots in Fig. 9). For both a low and a high number of kneading discs, for the location 1,
419 3 and 5 the aspect ratio distribution were quite similar regardless of the throughput. This
420 indicates that consolidation of the granules went well along with the aggregation during the
421 conveying of the granules in the TSG barrel.

422 These results suggest that increased mixing is required when the throughput and the
423 L/S are high. Since the mixing of the wetted powder inside the TSG is mainly distributive,
424 the most effective mixing in this condition can be obtained by increasing the number of
425 kneading discs. Besides, a high shear and a low fill level due to the increased conveying rate

426 at high screw speed can lead to a very efficient mixing in the TSG barrel (Vercruyssen et al.,
427 2012). These results also suggest that at increased shear first the wetted granules' shape
428 changes through consolidation, only after which the breakage occurs.

429 *3.2.4. Effect of increase in screw speed*

430 At low throughput and L/S, when the screw speed was increased from 500 rpm (ID 1 plot
431 of Fig. 6) to 900 rpm (ID 1 plot of Fig. 8), there was no significant shift in the GSDs. Only
432 the measured torque level decreased for 12 kneading discs due to reduction in hindrance to
433 the flow at increased conveying rate and low filling ratio at high screw speed. Comparing
434 the shape dynamics, the distribution of shape followed a consistent pattern due to a lower
435 fill ratio and good mixing in the barrel. With an increasing number of kneading discs, there
436 was an increase in the aspect ratio due to an accumulated level of shear (ID 1 plots of Fig. 7
437 and 9).

438 At a low throughput and a high L/S, an increased screw speed assisted early aggregation
439 of the wetted powder, which is reflected by an increase in the fraction of larger granules for
440 all three sample locations (comparing ID 2 plots of Fig. 6 and 8). The addition of more
441 kneading discs further increased the agglomeration level and a successive reduction in the
442 amount of fines. Moreover, at increased screw speed together with an increase in the number
443 of kneading discs, the granules became more spherical (comparing ID 2 plots of Fig. 7 and
444 9). It can be assumed that increased shear caused a greater consolidation of granules and
445 consequently an increased sphericity, while making squeezed-out liquid available to a further
446 granulate leading to the further shift of the GSD towards larger diameters.

447 However, when the feed rate was high and the L/S was low, an increase in the screw
448 speed resulted in an early aggregation of the particles with minimal number of kneading discs
449 (comparing ID 3 plots in Fig. 6 and 8). The addition of more kneading discs to the screw
450 caused a reduction in the amount of fines. However, for the configuration with 12 kneading
451 discs there was a reduction in the number density of larger particle sizes at successive sample
452 locations indicating breakage of larger granules induced by the second kneading block (ID
453 3 plot for 12 kneading discs in Fig. 8). This is likely due to availability of insufficient liquid

454 to make strong bridges between the particles in the granules, which was also reflected in the
455 aspect ratio where no significant change in the shape distribution was observed due to lack
456 of additional particle growth processes (comparing ID 3 plots in Fig. 7 and 9).

457 The effect of an increase in screw speed at high levels of throughput and L/S was discussed
458 in section 3.2.3. The major contribution of increasing the screw speed at high throughput
459 and L/S was the reduction in granulator torque, without affecting the GSD. This is desirable
460 at manufacturing scale from a productivity point of view where operation at high throughput
461 is a prerequisite.

462 These comparisons suggest that along with the distributive mixing by the kneading discs,
463 the shear-induced mixing by increasing screw speed is another important factor in mixing.
464 However, increasing the screw speed reduces the mean residence time of the wet powder
465 in the barrel. Hence, a competitive relationship exists between the shear mixing in the
466 barrel and the residence time of the wetted powder, both of which are desired to support
467 granulation rate processes. Except for the granules which are brittle due to lack of sufficient
468 granulation liquid, the shape distribution at high shear remains the same compared to low
469 shear conditions. This suggests that the shape of granules largely depends on the design of
470 the screws and not on the shear level.

471 **4. Conclusions**

472 This study showed that a balanced mixing is important to change the granule charac-
473 teristics through aggregation and breakage mechanisms along with the consolidation of the
474 particles. The fill ratio in the barrel is an important factor both because it affects the torque
475 required by the granulator drive, and it plays a major role in changing the size and shape
476 of the particles. Increasing throughput is beneficial only when sufficient granulation liquid
477 and shear mixing is present to make strong agglomerates. An increase in throughput causes
478 a higher torque, which can be resolved by increasing the screw speed. The deformation
479 of wet granules is easy and granules with a more uniform shape are produced. A number
480 of competing mechanisms, such as aggregation, consolidation and breakage occur in the

481 process. Although this study provided a detailed insight regarding the process, the experi-
482 mental data produced only semi-quantitative insight into which of these mechanisms were
483 dominant. Unlike experimental results, where only the collected data are available, mecha-
484 nistic models are more transparent in the sense that any and all of the intermediate data can
485 be observed after simulation (given a thoroughly validated model is available). Therefore
486 the results obtained from this study will now be used as the basis for the development of
487 a mechanistic model to further improve our understanding of the granulation process in a
488 TSG.

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493 Wommelgem, Belgium) for his support in this endeavour.

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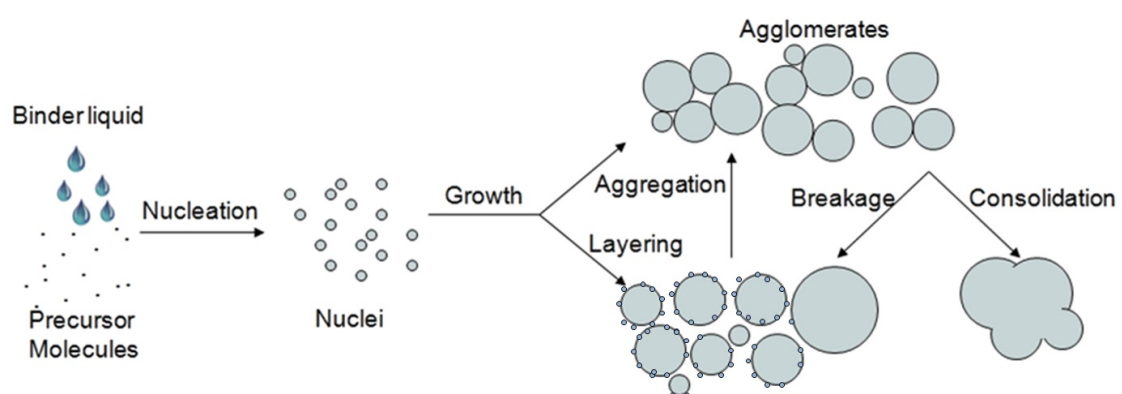


Figure 1: Schematic presentation of the wet granulation process.

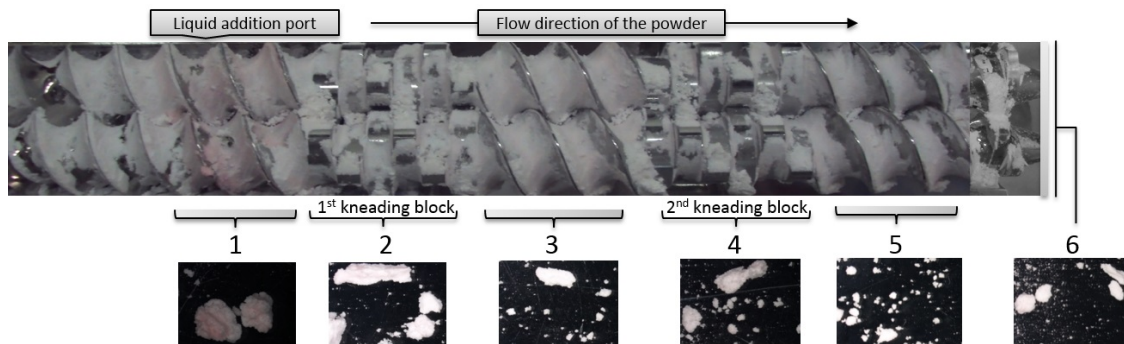


Figure 2: Screw configuration with 12 kneading discs (2 blocks) used in the twin screw granulator during the study. Sampling locations along the screw length: [1] before first kneading block, [2] on the first kneading block [3] between first and second kneading block, [4] on the second kneading block [5] after second kneading block, [6] outlet of the granulator.

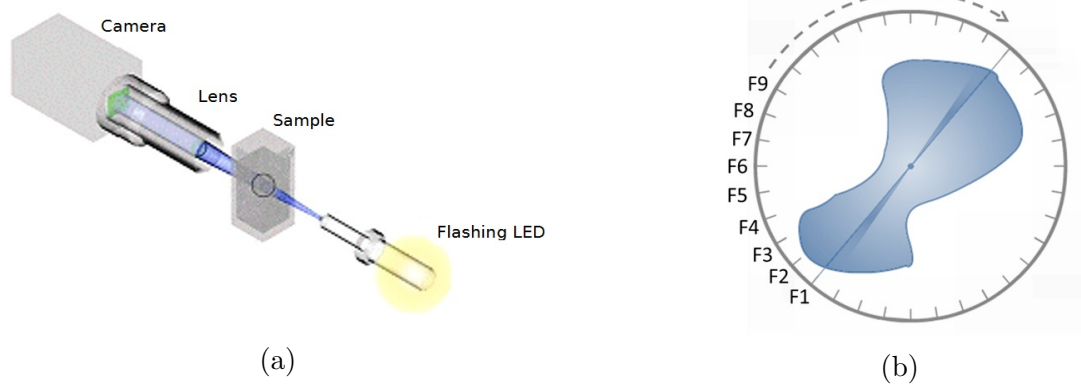
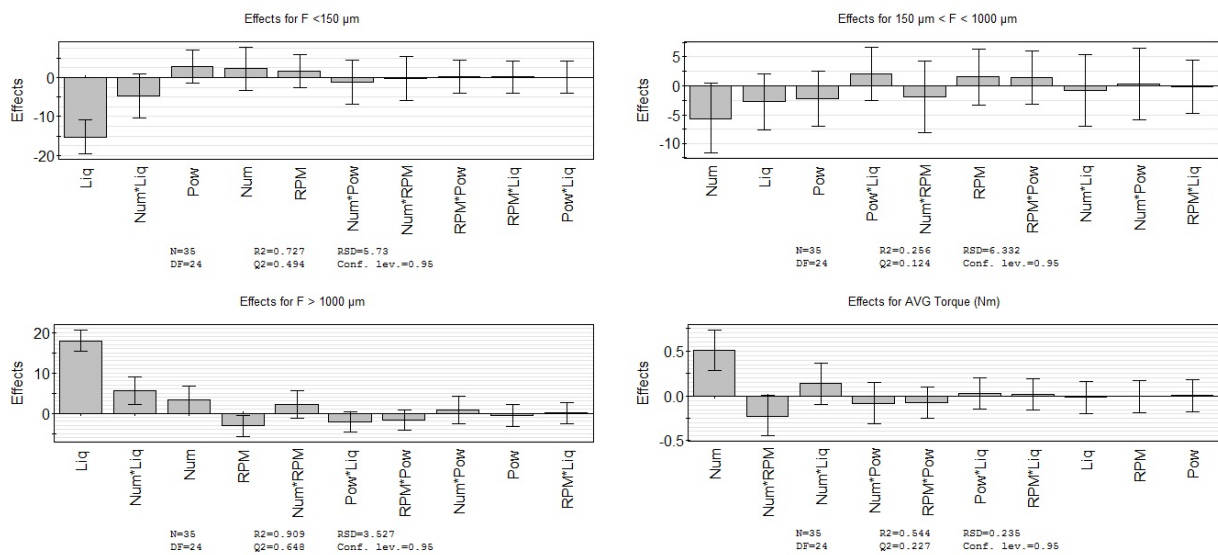


Figure 3: (a) Principle of the dynamic image analysis technique. The shape and size of the granule are determined based on the imaged formed by the LED flashing light passing directly through the sample and captured by the camera. (b) The Ferret diameters provide information on the size (average Ferret diameter), give deep insight into the granules morphology (minimum Ferret and maximum Ferret) and serve as a basis for the calculation of the aspect ratio.



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Figure 4: Effect plots of the partial least squares (PLS) models showing the mean responses of number of kneading discs (Num), screw speed (Scr) [500-900 rpm], throughput (Pow) [10-25 kg/h] and liquid-solid ratio (Liq) [4.58-6.72%] on the size fractions (F) defined as fines ($F < 150 \mu\text{m}$), fraction of interest for tableting ($150 \mu\text{m} < F < 1000 \mu\text{m}$) and oversized granules ($F > 1000 \mu\text{m}$) and the measured torque.

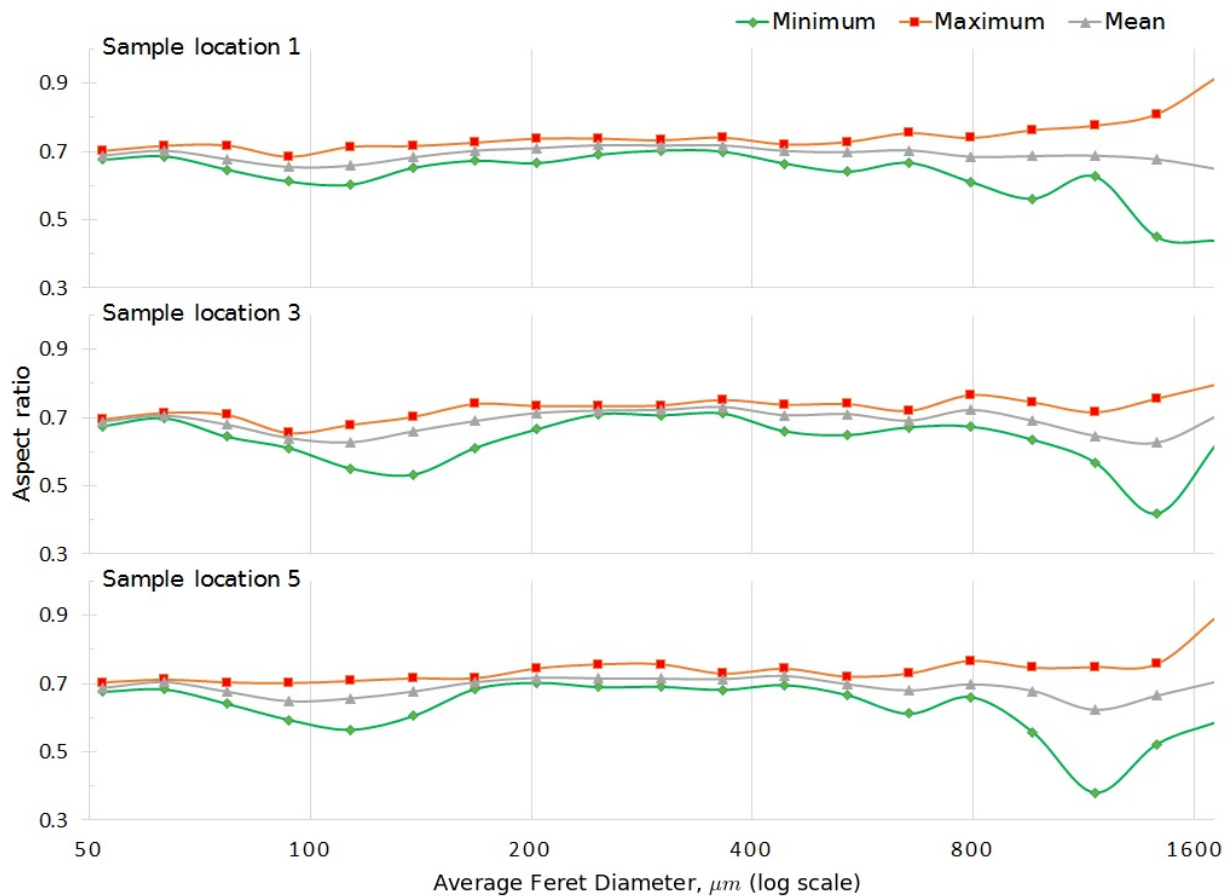


Figure 5: Mean, maximum and minimum aspect ratios vs. mean Feret diameter of the granules in the range of 50 to 1600 μm (log scale, x-axis) at location 1 (top subplot), location 3 (middle subplot) and location 5 (bottom subplot) in barrel for the runs performed at different throughputs (10, 25 kg/h), liquid-to-solid ratio (4.58, 6.72% (w/w)), screw speed (500, 900 rpm) and number of kneading discs (4, 12).

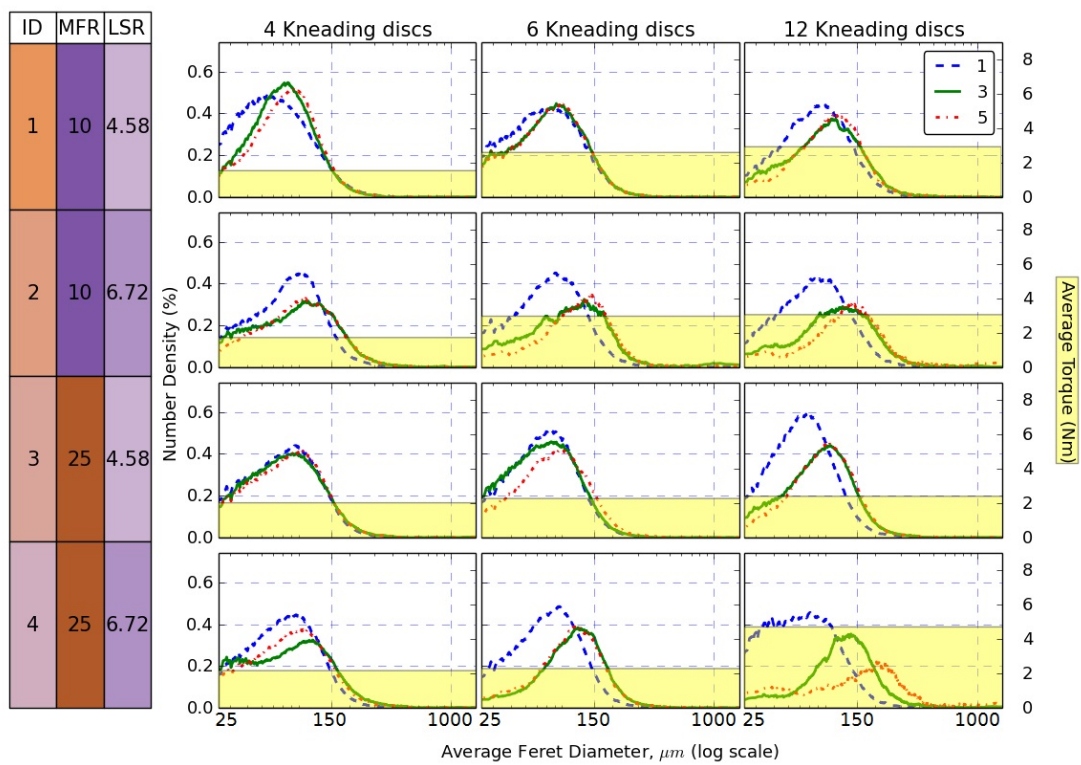


Figure 6: Number density of the granules (primary y-axis) having an average Feret diameter in the range of 50 to 1500 μm (log scale, shared x-axis) and torque level (secondary y-axis) at different throughputs (10-25 kg/h), liquid-to-solid ratio (4.58-6.72% (w/w)) at low screw speed (500 rpm) [ID: experiment ID, MFR: throughput (kg/h), LSR: liquid-solid ratio (%)].

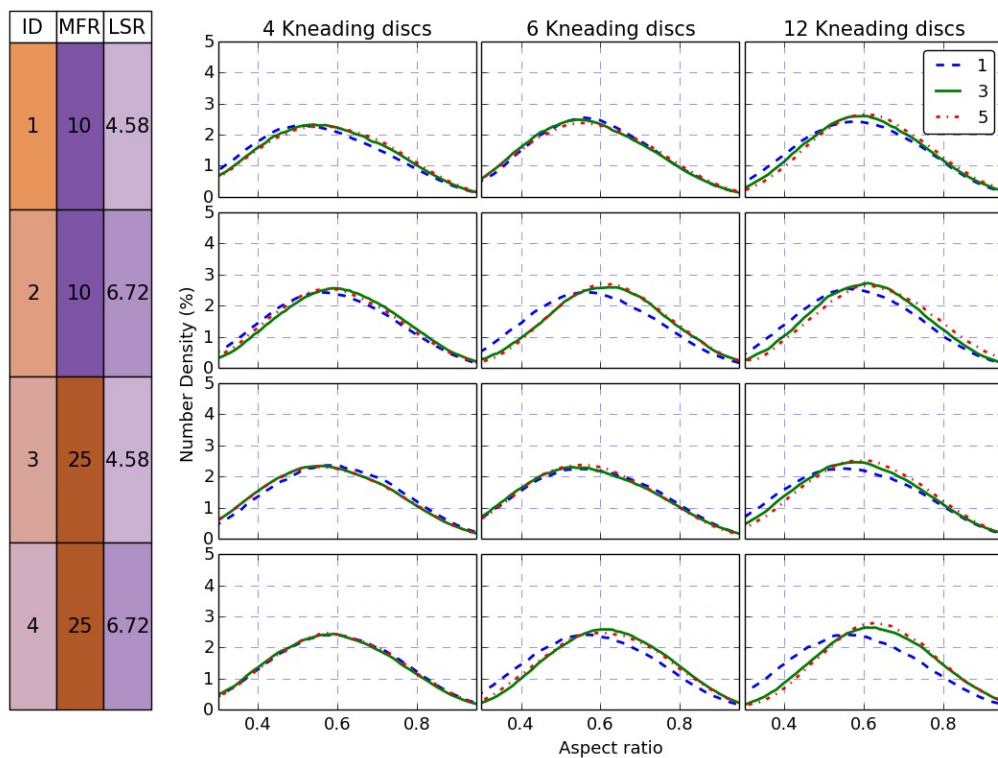


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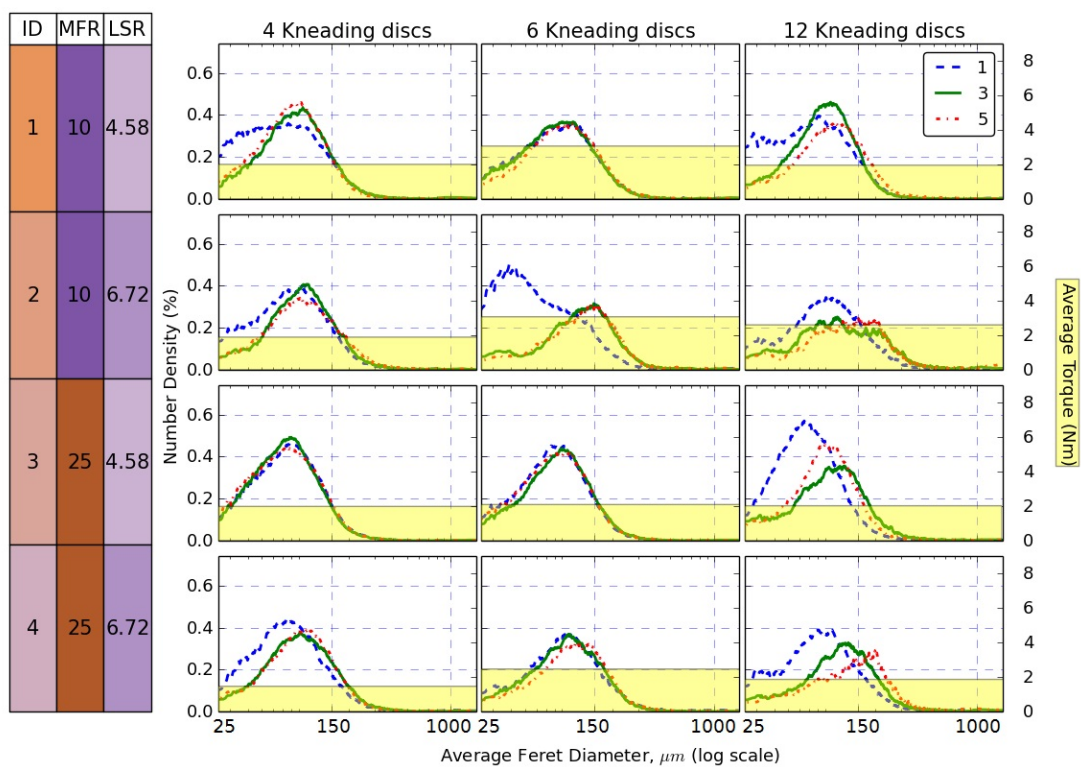


Figure 8: Number density of the granules (primary y-axis) having an average Feret diameter in the range of 50 to 1500 μm (log scale, shared x-axis) and torque level (secondary y-axis) at different throughputs (10-25 kg/h), liquid-to-solid ratio (4.58-6.72% (w/w)) at high screw speed (900 rpm) [ID: experiment ID, MFR: throughput (kg/h), LSR: liquid-solid ratio (%)].

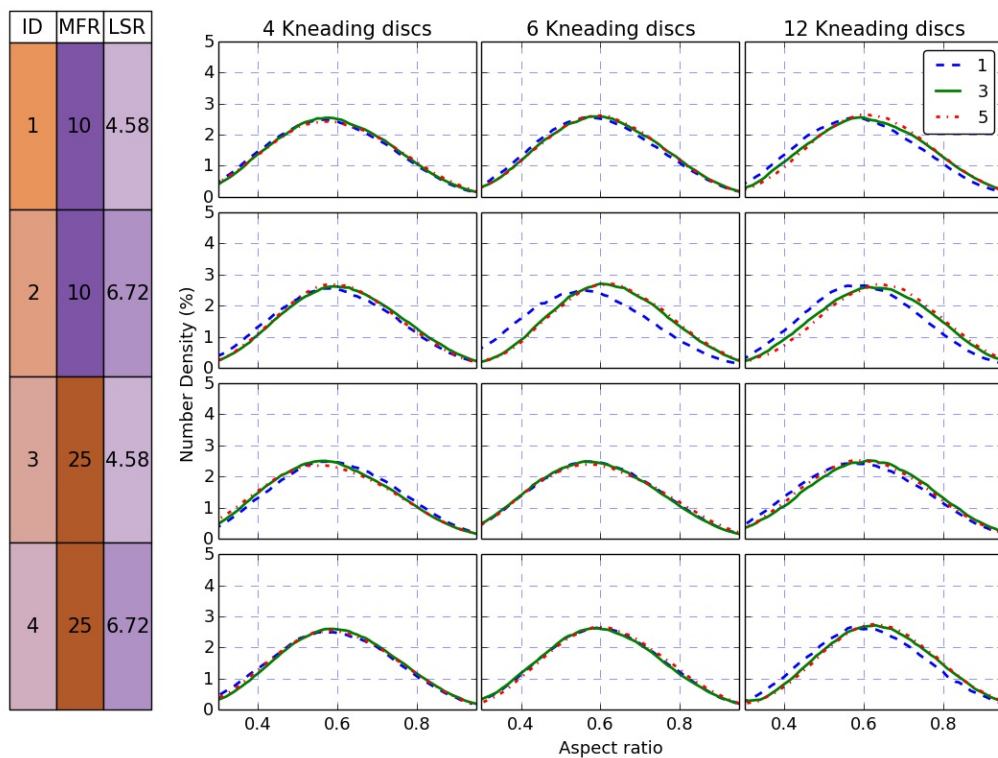


Figure 9: Number density of the granules (primary y-axis) having an aspect ratio in the range of 0.3 to 1 (shared x-axis) at different throughputs (10-25 kg/h), liquid-to-solid ratio (4.58-6.72% (w/w)) at low screw speed (900 rpm) [ID: experiment ID, MFR: throughput (kg/h), LSR: liquid-solid ratio (%)].

576 **List of Tables**

577 1 Overview of experimental design runs: factor variables (number of kneading
578 discs, screw speed, throughput and liquid-solid ratio) and responses (Torque,
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580 tableting) and $F > 1000 \mu\text{m}$ (defined as oversized) granules). 34

Table 1: Overview of experimental design runs: factor variables (number of kneading discs, screw speed, throughput and liquid-solid ratio) and responses (Torque, $F < 150 \mu\text{m}$ (defined as fines), $150 \mu\text{m} < F < 1000 \mu\text{m}$ (fraction of interest for tableting) and $F > 1000 \mu\text{m}$ (defined as oversized) granules).

Run Order	Number of kneading discs (-)	Screw speed (RPM)	Throughput (Kg/h)	L/S ratio (%)	Torque (N-m)	$F < 150 \mu\text{m}$ (%)	150-1000 μm (%)	$F > 1000 \mu\text{m}$ (%)
1	2	500	10	4.58	34.95	42.19	22.86	1.38
2	4	500	10	4.58	40.66	37.95	21.39	1.84
3	6	500	10	4.58	38.28	43.77	17.95	2.59
4	12	500	10	4.58	43.2	37.87	18.93	2.92
5	2	900	10	4.58	37.86	46.02	16.11	1.25
6	4	900	10	4.58	43.12	39.53	17.34	2.00
7	6	900	10	4.58	42.78	39.25	17.96	3.06
8	12	900	10	4.58	40.68	37.62	21.7	1.95
9	2	500	25	4.58	36.25	35.66	28.09	1.30
10	4	500	25	4.58	45.79	31.01	23.19	2.02
11	6	500	25	4.58	42.52	37.54	19.93	2.27
12	12	500	25	4.58	45.41	34.69	19.91	2.4
13	2	900	25	4.58	39.87	38.88	21.25	1.55
14	4	900	25	4.58	45.87	36.15	17.98	1.98
15	6	900	25	4.58	43.9	40.89	15.21	2.09
16	12	900	25	4.58	45.07	35.89	19.04	2.02
17	2	500	10	6.72	22.29	39.62	38.10	0.92
18	4	500	10	6.72	22.55	35.65	41.80	1.73
19	6	500	10	6.72	28.49	32.80	38.71	2.97
20	12	500	10	6.72	23.80	34.84	41.36	3.06
21	2	900	10	6.72	23.56	39.75	36.7	1.44
22	4	900	10	6.72	25.70	33.27	41.04	1.89
23	6	900	10	6.72	29.04	34.82	36.15	3.07
24	12	900	10	6.72	22.19	35.15	42.66	2.6
25	2	500	25	6.72	26.14	36.3	37.56	1.24
26	4	500	25	6.72	29.37	32.43	38.21	2.16
27	6	500	25	6.72	33.58	33.71	32.71	2.28
28	12	500	25	6.72	16.10	34.46	49.43	4.7
29	2	900	25	6.72	26.01	44.26	29.73	1.54
30	4	900	25	6.72	30.72	34.44	34.84	1.46
31	6	900	25	6.72	32.58	37.62	29.79	2.46
32	12	900	25	6.72	26.25	31.31	42.44	1.86
33	4	700	17.5	6	22.58	55.90	21.52	1.33
34	4	700	17.5	6	18.52	53.03	28.45	1.32
35	4	700	17.5	6	20.59	55.50	23.92	1.24