

# Versatility and stability optimization of flow-focusing droplet generators via quality metric-driven design automation

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**Supplementary Table 1:** Overview of all droplet generators used in this study

Device Description	Or (um)	Or <sub>L</sub>	W <sub>d</sub>	W <sub>c</sub>	E	A.R	Ca	F.R.R
Orthogonal Device #1 (Figure 2)	75	1	2	2	2	1	.06-1.05	10-22
Orthogonal Device #2 (Figure 2)	75	1.5	2.5	2.5	3	1.5	.06-1.05	10-22
Orthogonal Device #3 (Figure 2)	75	2	3	3	4	2	.06-1.05	10-22
tOrthogonal Device #4 (Figure 2)	75	2.5	3.5	3.5	5	2.5	.06-1.05	10-22
Orthogonal Device #5 (Figure 2)	75	3	4	4	6	3	.06-1.05	10-22
More Versatile (Figure 3)	75	3	2	2	4.5	1	.05-1.05	2-22
Less Versatile (Figure 3)	150	1	4	4	2	3	.05-1.05	2-22
More Versatile (Figure 4)	150	2	2	2	5	1	.05-1.05	2-22
Less Versatile (Figure 4)	175	1.5	2.5	2.5	2	1	.05-1.05	2-22
More stable (Figure 5)	175	3	2	2	3.5	1.5	.05-1.05	2-22
Less stable (Figure 5)	75	1	3.5	3.5	2	3	.05-1.05	2-22
More stable (Figure 6)	175	2.5	3	2.9	6	1	.05-1.05	2-22
Less stable (Figure 6)	175	3	3.3	3	2	1.5	.05-1.05	2-22

*Abbreviations:* **Or** - orifice width; **Or<sub>L</sub>** -normalized orifice length; **W<sub>d</sub>**– normalized dispersed phase (water) input; **W<sub>c</sub>** – normalized continuous phase (oil) input; **E** – Expansion ratio; **A.R** – Aspect ratio; **Ca** - capillary number; **F.R.R** – Flow rate ratio

**Supplementary Table 2:** Correlation coefficients (R<sup>2</sup>) for design parameters and versatility scores in the dripping regime

	Or (um)	Or <sub>L</sub>	W <sub>d</sub>	W <sub>c</sub>	E	A.R
<b>Overall Score</b>	-0.19	0.41	-0.13	-0.18	0.17	-0.51
<b>Size Score</b>	0.57	-0.06	-0.01	-0.20	-0.02	0.58
<b>Rate Score</b>	-0.53	0.39	-0.05	-0.03	0.012	-0.60

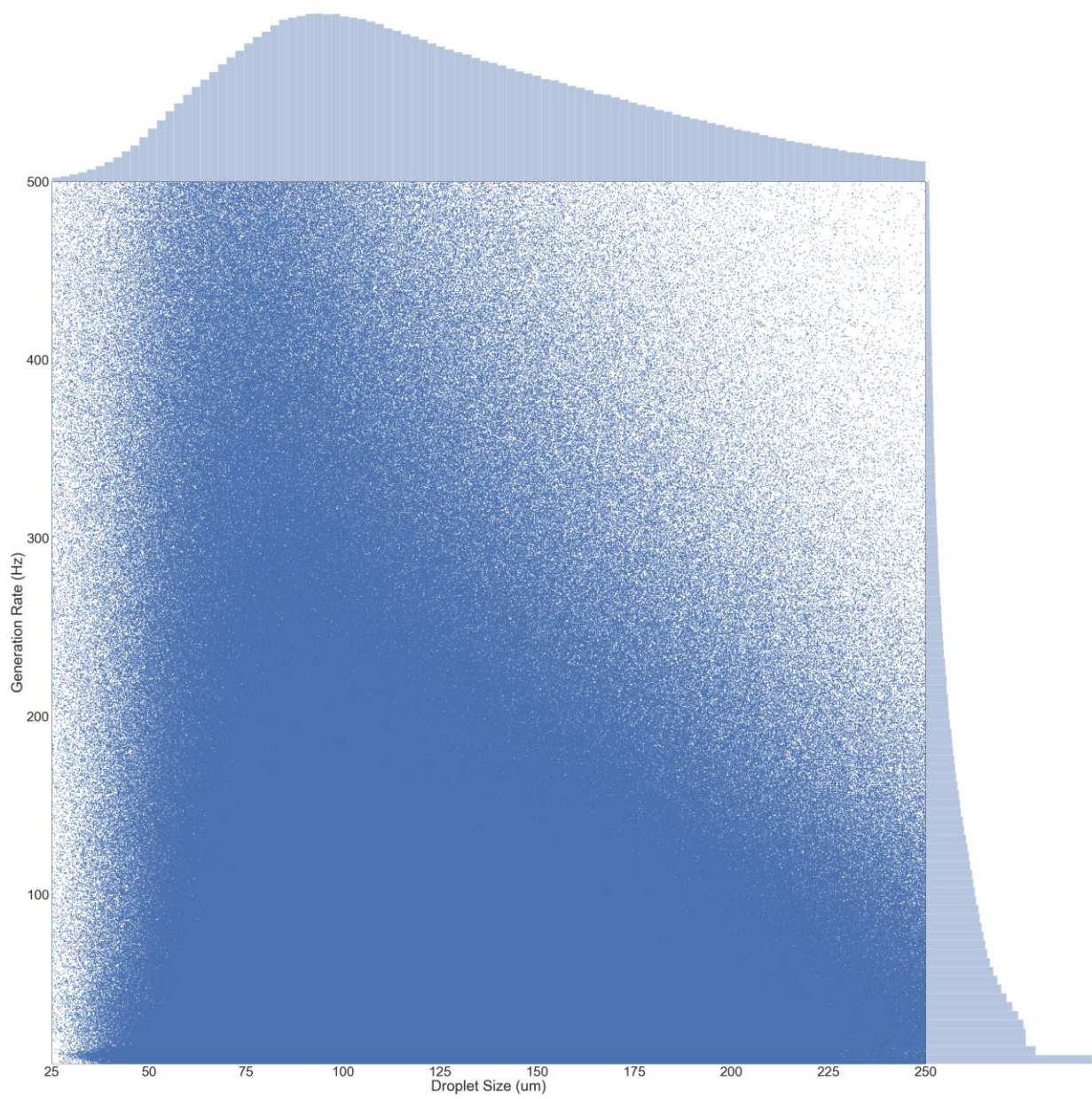
*Interpreting R<sup>2</sup> values:* **-1.0 < R<sup>2</sup> < -0.7** – strong negative correlation; **-0.7 < R<sup>2</sup> < -0.5** – moderate negative correlation; **-0.5 < R<sup>2</sup> < -0.3** – weak negative correlation; **-0.3 < R<sup>2</sup> < 0.3** – negligible correlation; **0.3 < R<sup>2</sup> < 0.5** – weak positive correlation; **0.5 < R<sup>2</sup> < 0.7** – moderate positive correlation; **0.7 < R<sup>2</sup> < 1.0** – strong positive correlation

**Supplementary Table 3:** Correlation coefficients (R<sup>2</sup>) for design parameters and versatility scores in the jetting regime

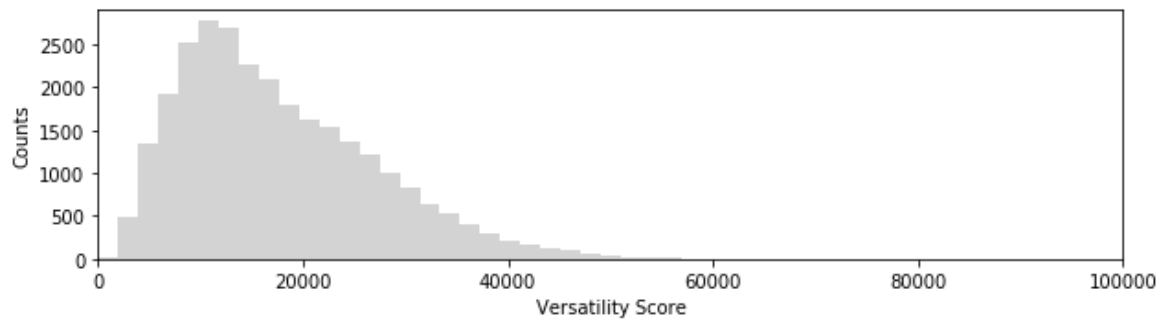
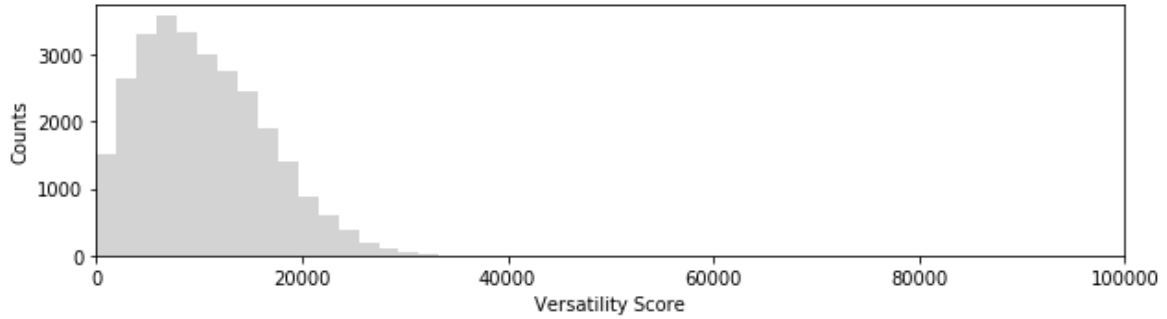
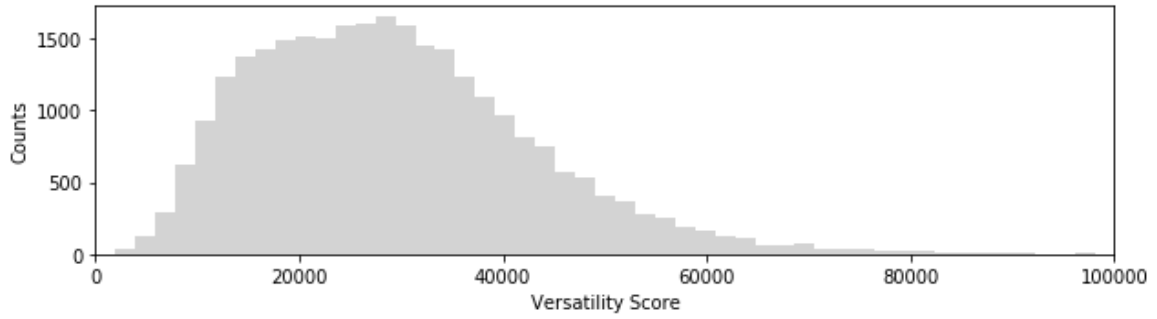
	Or (um)	Or <sub>L</sub>	W <sub>d</sub>	W <sub>c</sub>	E	A.R
<b>Overall Score</b>	-0.05	0.06	-0.58	0.33	-0.35	-0.05
<b>Size Score</b>	0.54	-0.15	-0.10	-0.23	0.66	0.26
<b>Rate Score</b>	-0.29	0.08	-0.46	0.3	-0.59	-0.18

**Supplementary Table 4:** Correlation coefficients (R<sup>2</sup>) for design parameters and stability scores in the dripping and jetting regime

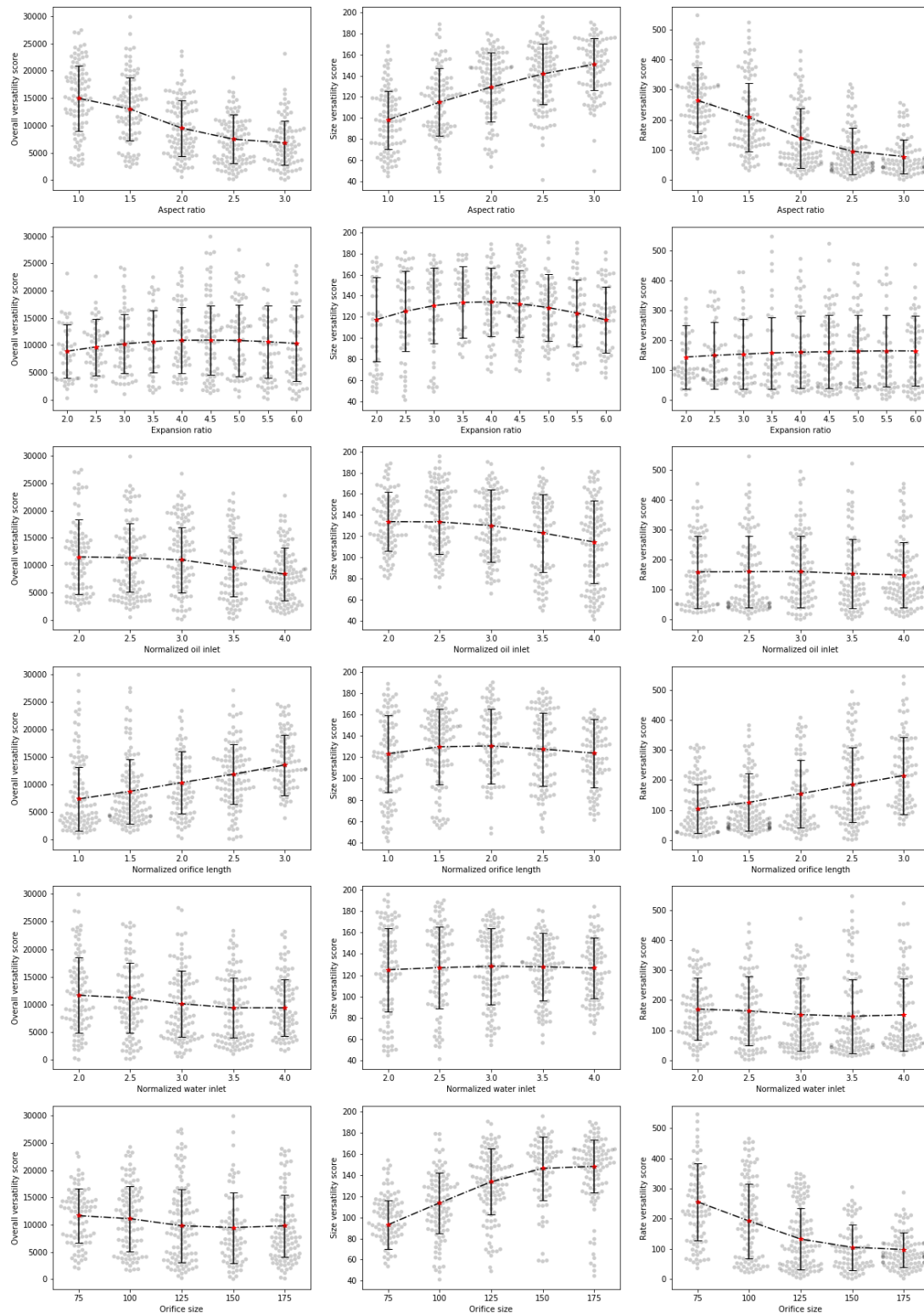
	Or (um)	Or <sub>L</sub>	W <sub>d</sub>	W <sub>c</sub>	E	A.R	Ca	F.R.R
<b>Dripping</b>	0.54	0.16	-0.10	0.09	0.09	0.06	-0.21	0.01
<b>Jetting</b>	0.47	0.02	-0.26	0.17	0.00	0.33	0.46	-0.06



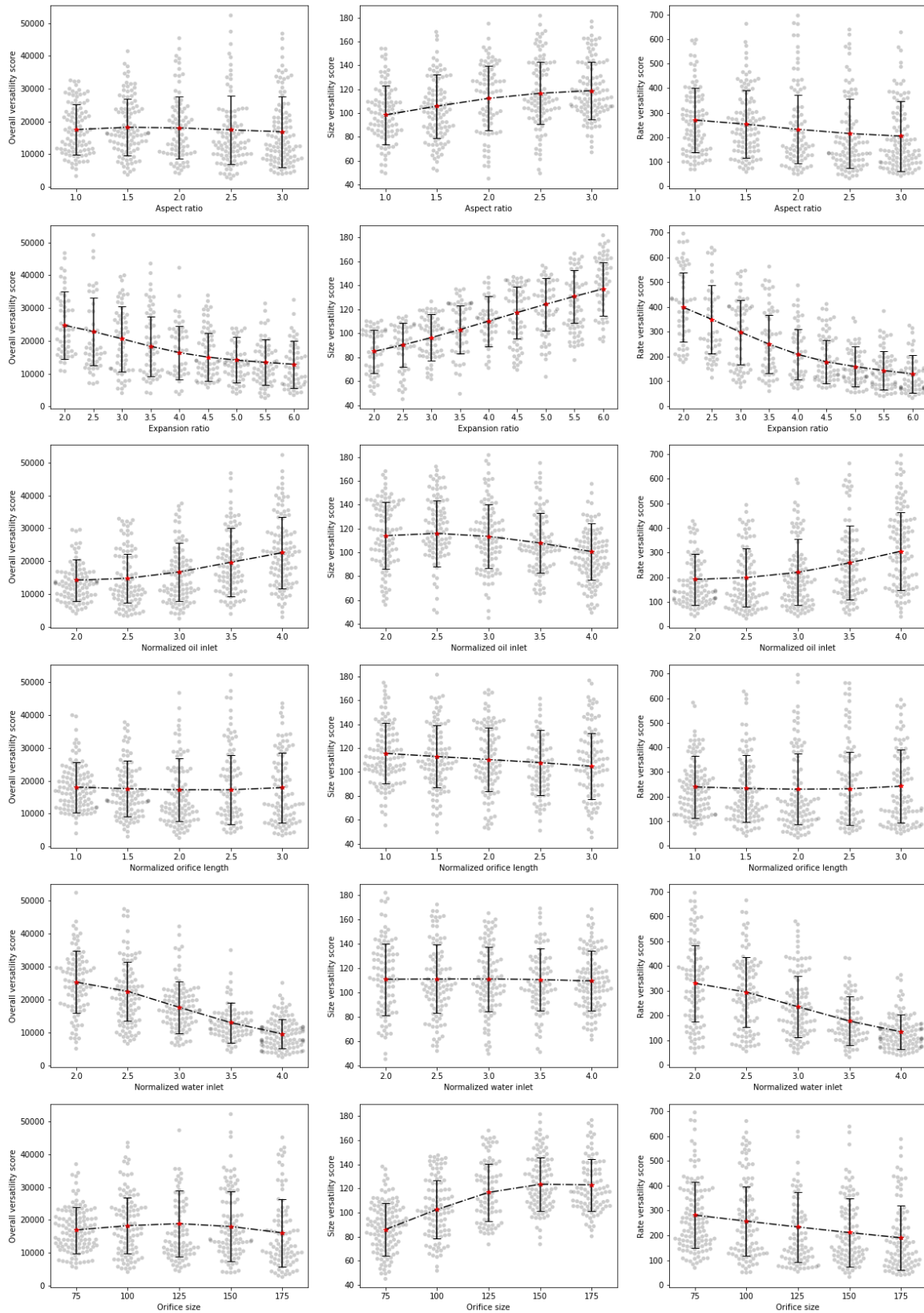
**Supplementary figure S1:** 2D distribution of droplet size and rate from the 4.2 million datapoints used in this study.



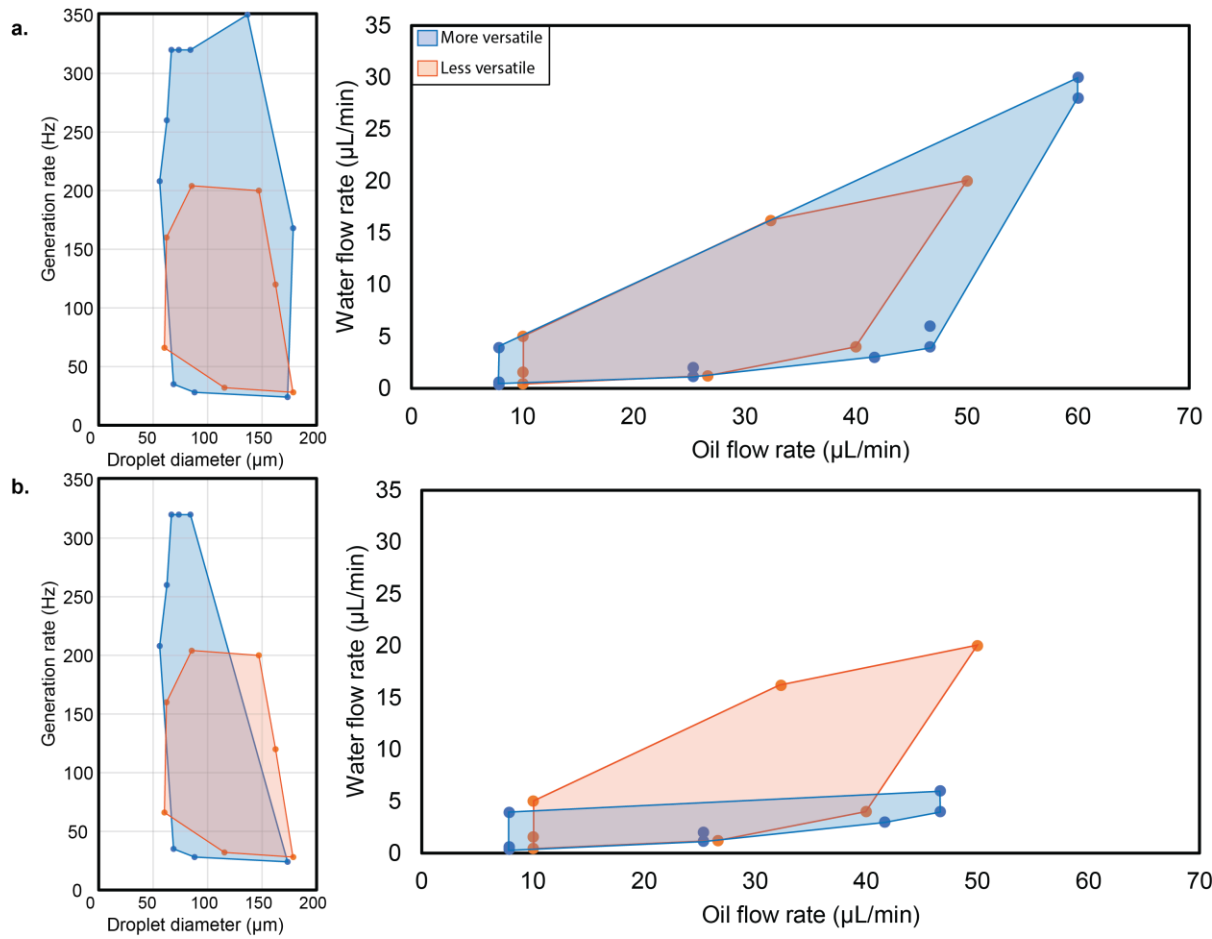
*Supplementary Figure S2: Distribution of versatility scores in both regimes (top), dripping regime (middle), and jetting regime (bottom).*



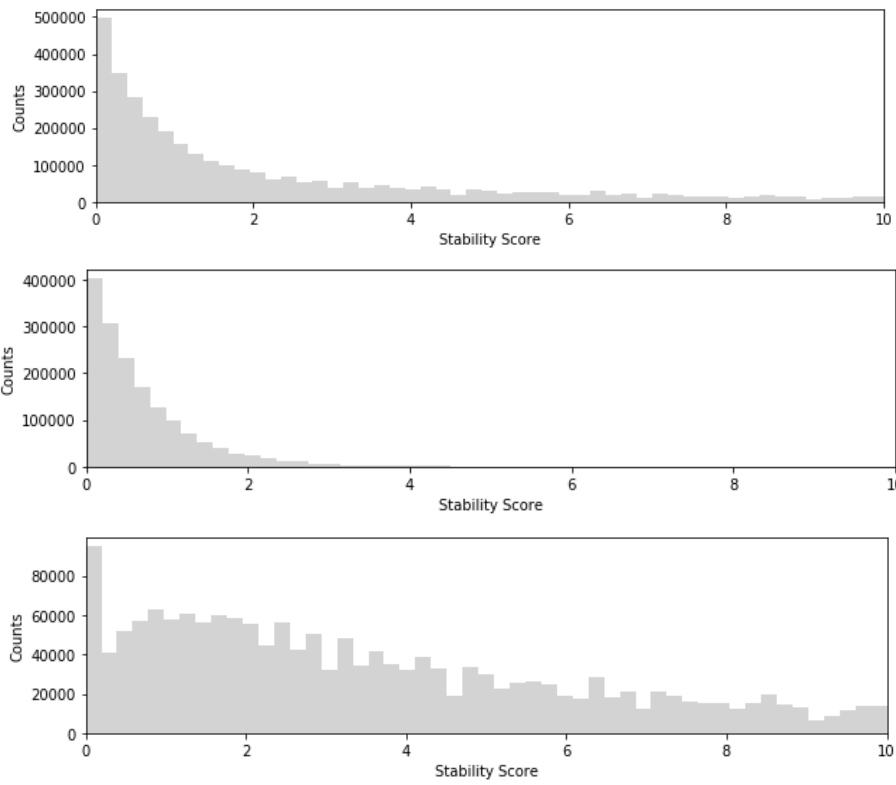
**Supplementary Figure S3: Diameter, generation rate, and overall versatility in the dripping regime.**



**Supplementary Figure S4: Main effect analysis of diameter, generation rate, and overall versatility in the jetting regime.**

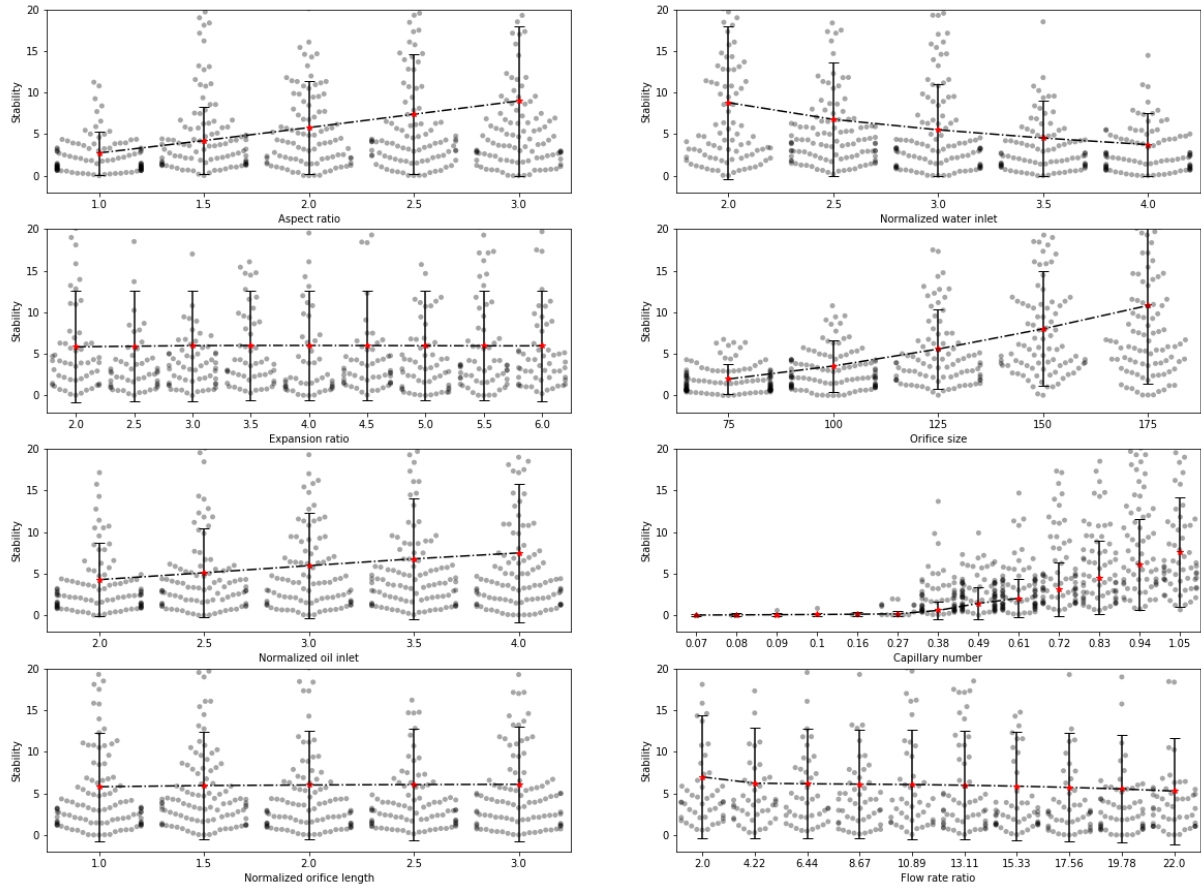


**Supplementary Figure S5: Summary of flow rate combinations used for the more and less versatile devices in main figures 2 and 3**

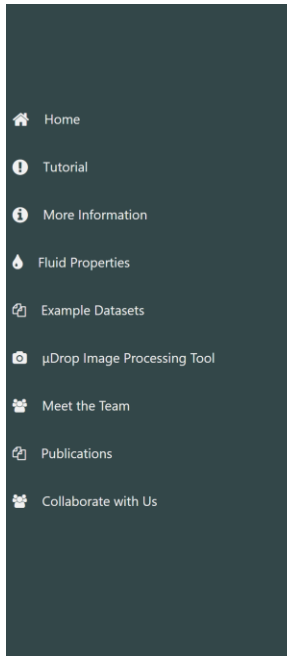


**Supplementary Figure S6: Distribution of stability scores in both regimes (top), dripping regime (middle), and jetting regime (bottom).**





*Supplementary Figure S7: Main effect analysis of stability in the jetting regime.*

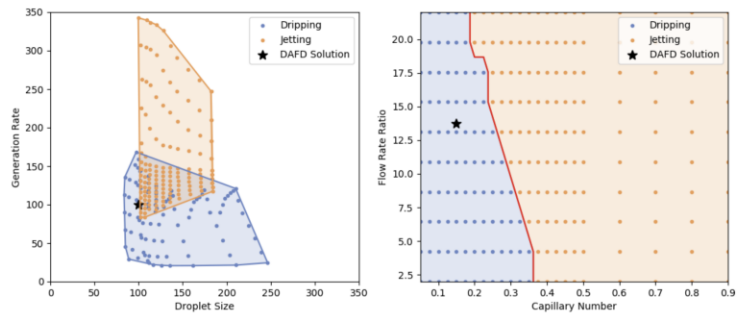


## Design Quality Metrics:

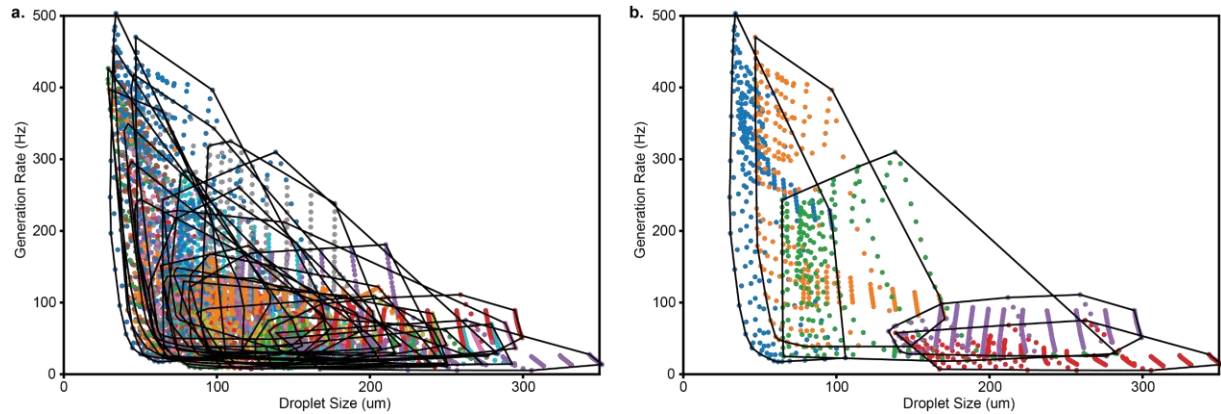
Using 3 candidate designs, the versatility and stability metrics of each candidate generator was calculated. Output designs were ranked according to **Stability**. [CLICK HERE](#) to download the designs and quality metrics for all candidates. Below, you can see the performance ranges of the top-ranked devices regime (versatility) as well as how close the device is to a regime boundary (stability). More info on this methodology can be found here (Note: this link currently not active, publication is in review).

### Droplet Generator Design:

Versatility (in both regimes):			Stability:
Overall score	Size score	Rate score	Stability score
33803.148	162.83	322.064	0.387



**Supplementary Figure S8: DAFD Quality metric design report.** If specified by the user, upon completion of metrics-driven design automation, a companion report will be generated to contextualize the results for the user.



**Supplementary Figure S9: Design space coverage of (a) the 25 orthogonal devices used in DAFD and (b) a selection of 5 of the orthogonal devices that can cover more than 99% of the design space.**