



**PAINTING
THE
METAVERSE**

KCGS 2021

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이화여자대학교 컴퓨터공학과

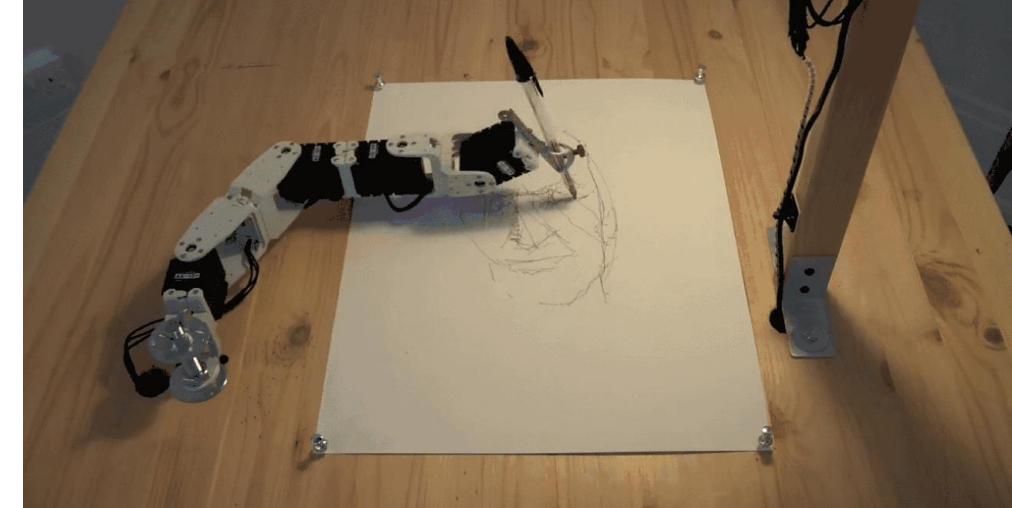
**모바일 매니퓰레이터 로봇을
이용한 TSP 펜아트**



Introduction - Robotic Drawing



[Line us, online]



[Tresset et al., C&G13]



[Cloud Painter, online]



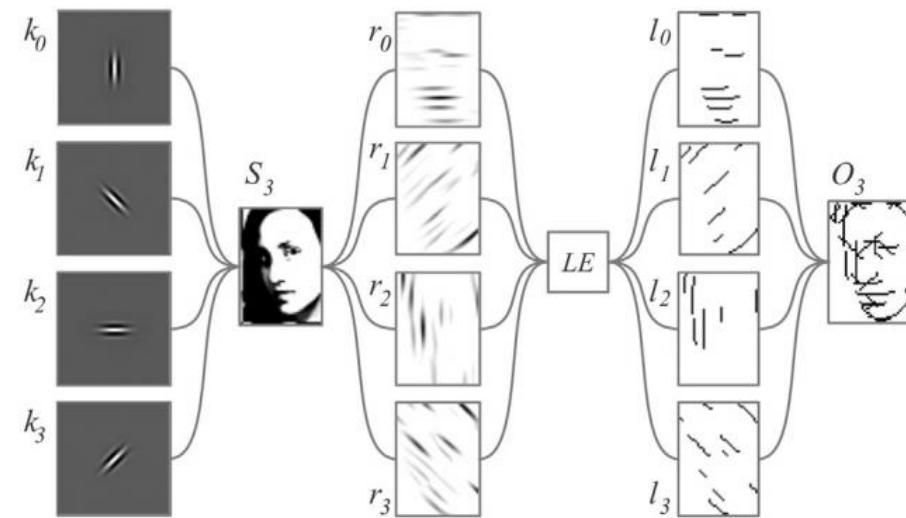
Introduction - Related Works



[Lu et al., ASME09]



[Song et al., ICRA18]



[Tresset et al., C&G13]



Introduction - Challenges

- Limited drawing canvas size and workspace due to fixed base
 - Use of mobile base robot to relax the constraint
- Weak replication of image on physical space
 - Convert raster images to vector set for robot drawing
 - Express details (e.g. brightness, color) using TSP art



Introduction - Research Goal

Robotic Drawing System using a Mobile Manipulator

- Large drawing canvas
- Complicated and detailed drawing



Introduction - TSP Art

- Traveling Salesman Problem(TSP) Art

: Single-stroke drawing generated by solving a TSP on the image

- Can easily be converted into continuous robot trajectories
- Can express details of input image with many pixels, colors, contrast



[Robert Bosch, online]



System Overview

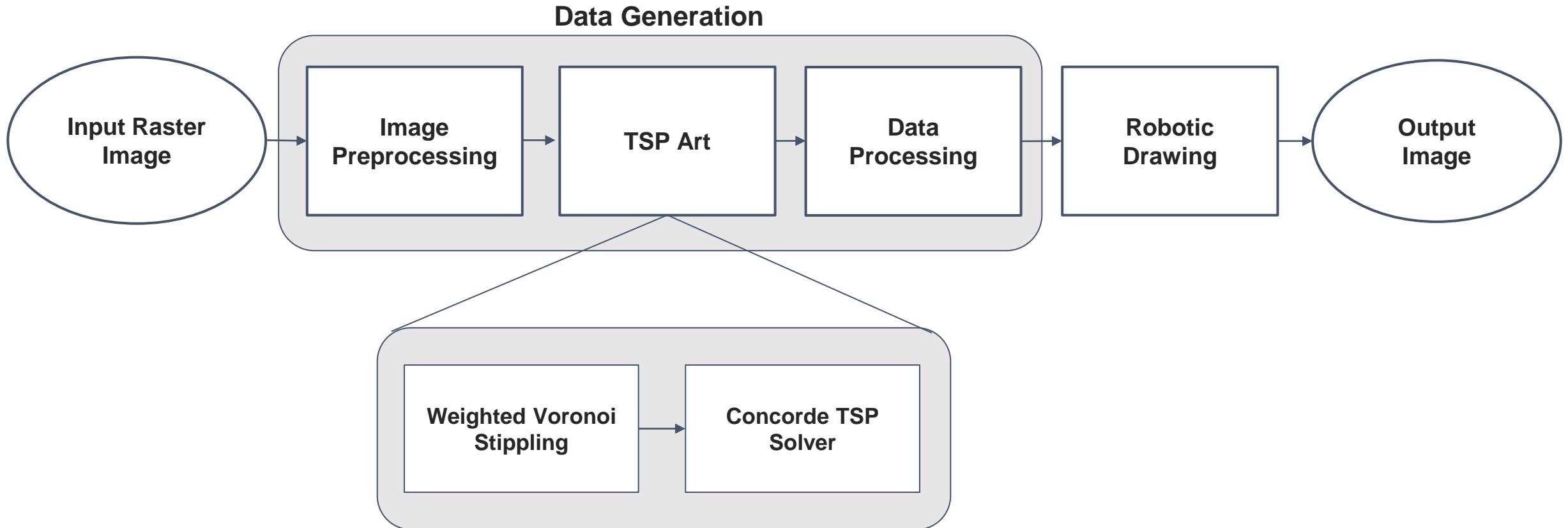




Image Preprocessing

- Color Channel Separation into CMYK
 - Use of four-color painting to reproduce the input color space in the physical space

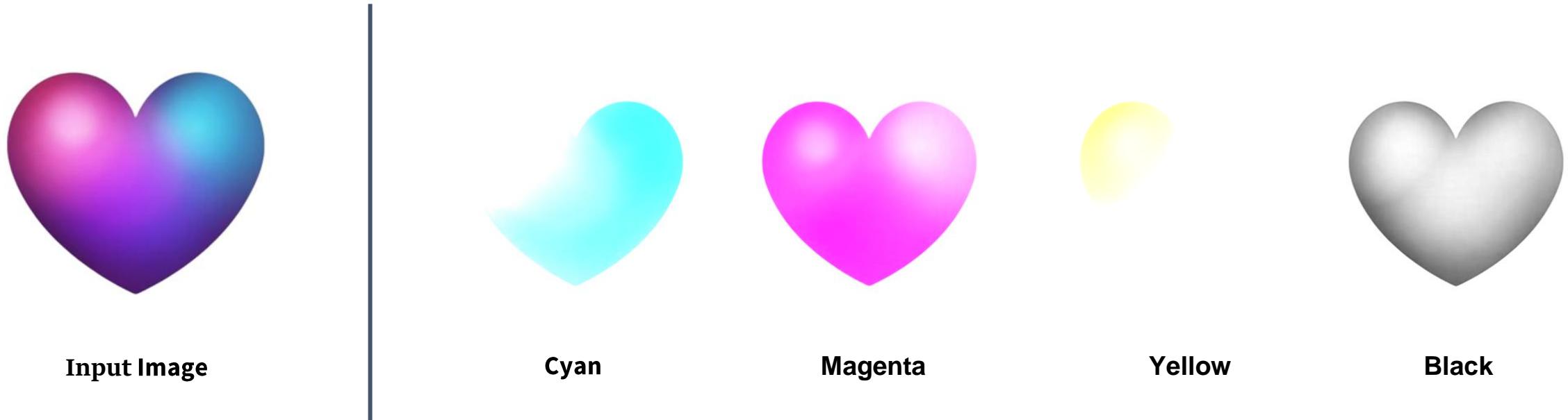


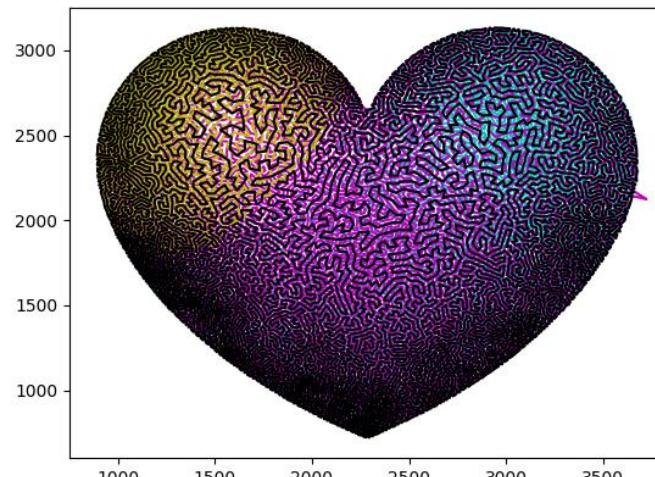


Image Preprocessing

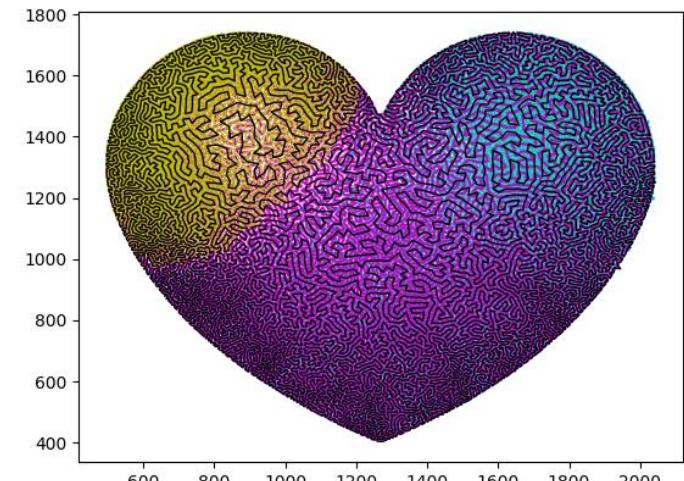
- Color Thresholding
 - To reduce the “blackness” that dominates other color channels when drawn on canvas



Input Image



Without Threshold and Saturation

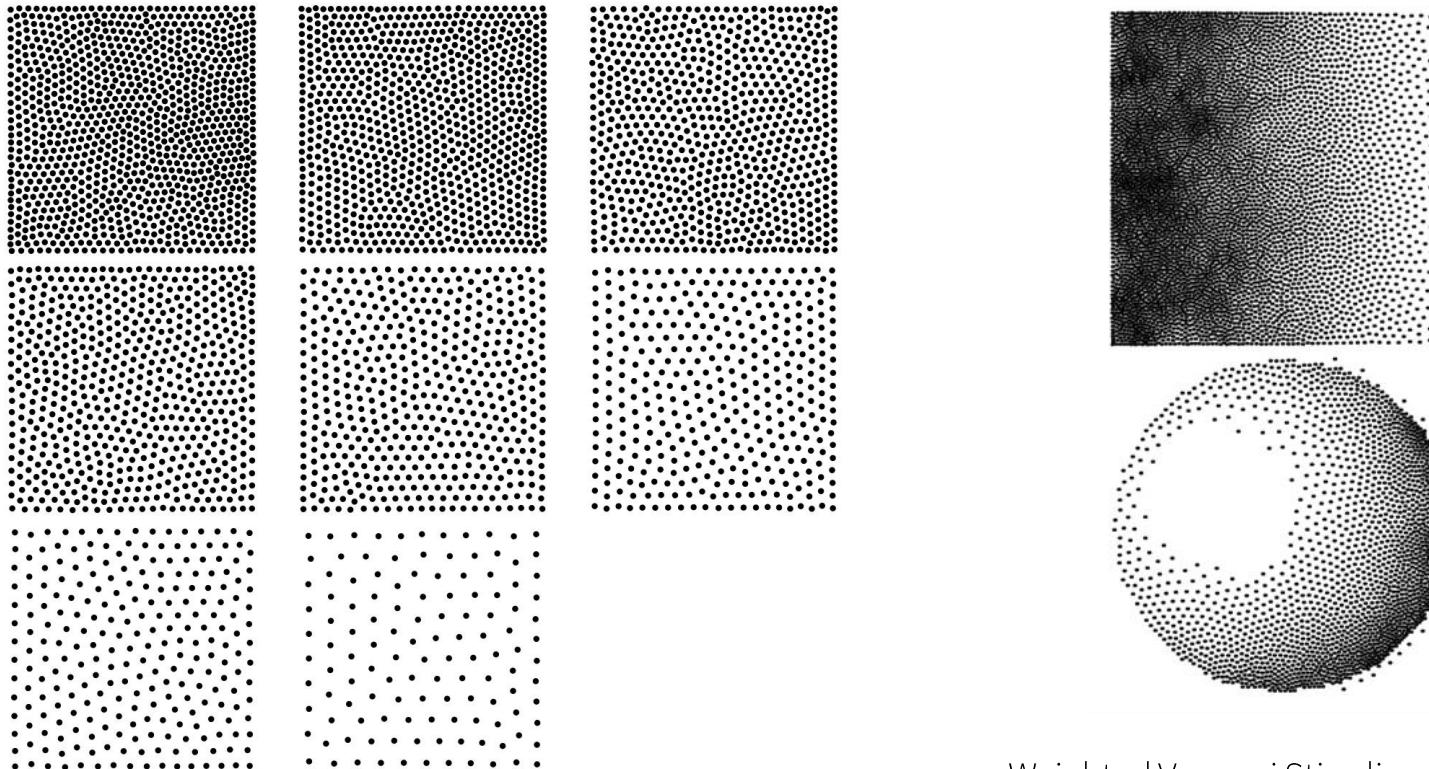


With Threshold and Saturation



TSP Art - Weighted Voronoi Stippling

- Generate stipple drawings from grayscale images using weighted centroidal Voronoi diagrams [Secord, NPAR 02]



Weighted Voronoi Stippling [Secord 02]

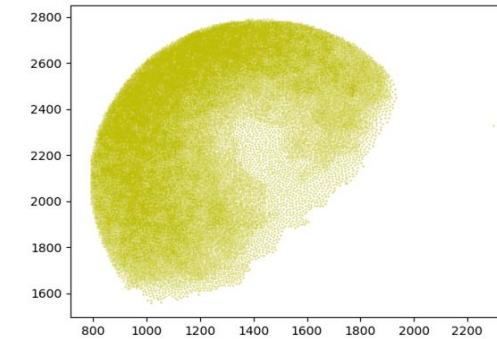
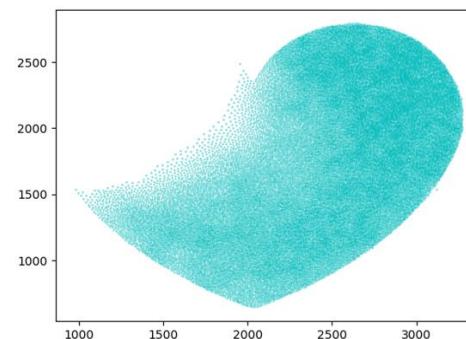
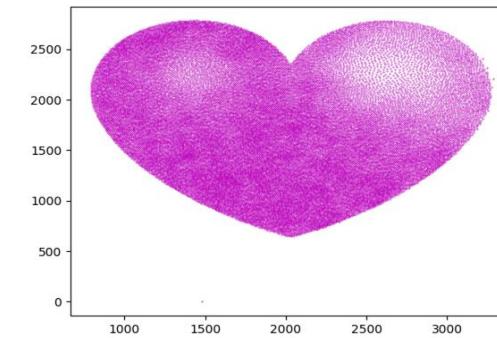
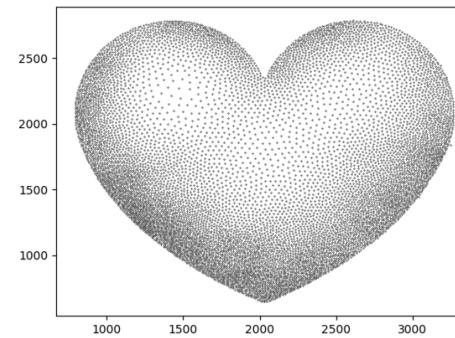


TSP Art - Weighted Voronoi Stippling

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Input Image

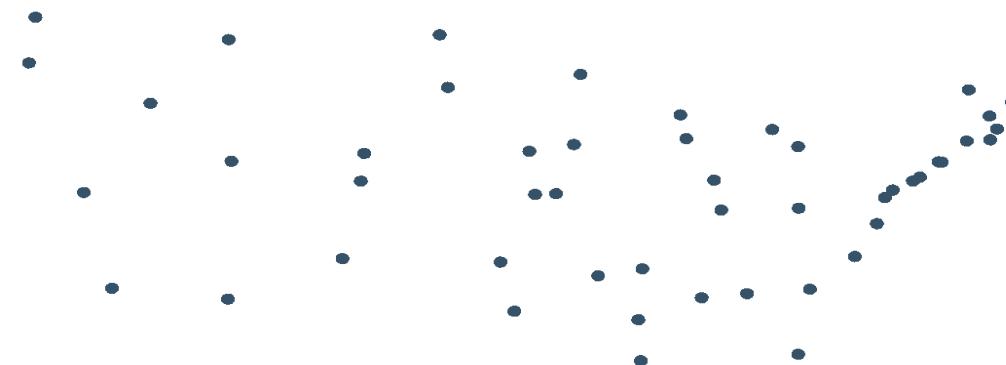


Stippling results of each C, M, Y, K split images



TSP Art - Concorde TSP Solver

- Iteratively solve relaxed linear programming of TSP using cutting-plane method [Applegate, Princeton University Press 06]
 - The cutting plane method eliminates flawed fractional solutions until an optimal solution is reached





TSP Art - Concorde TSP Solver

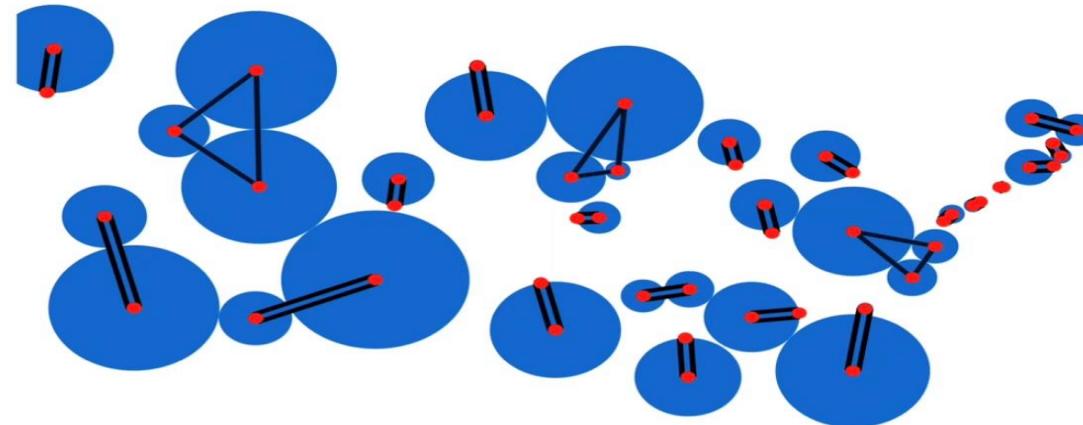
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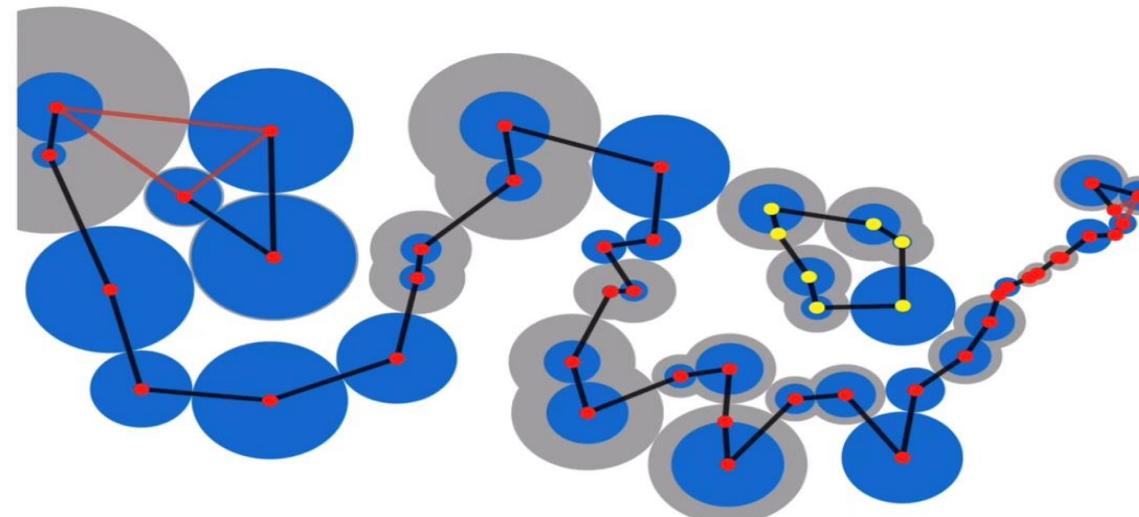
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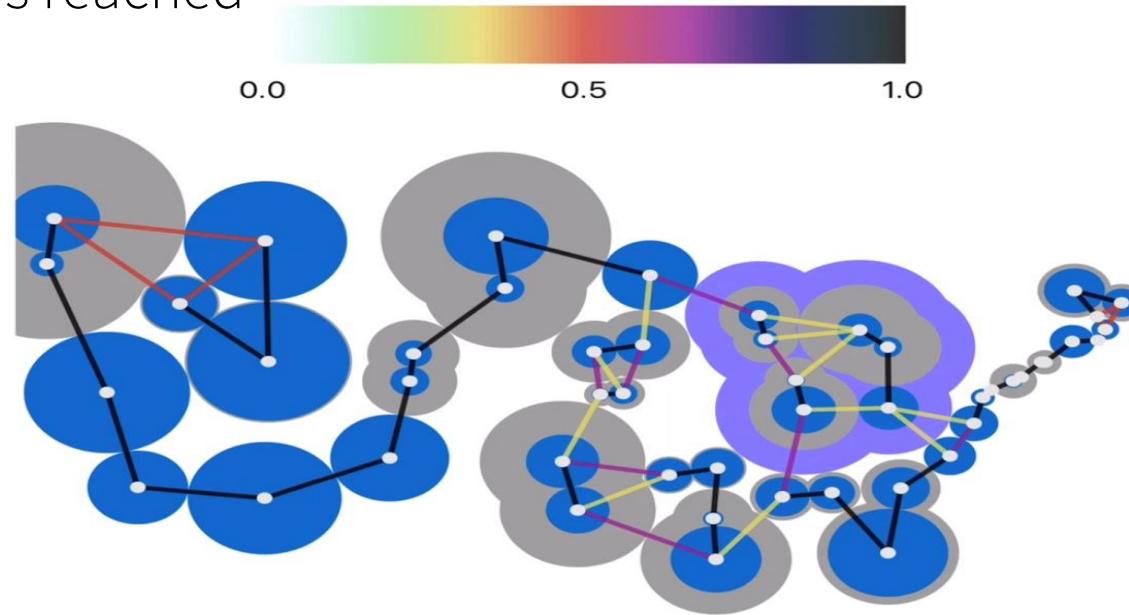
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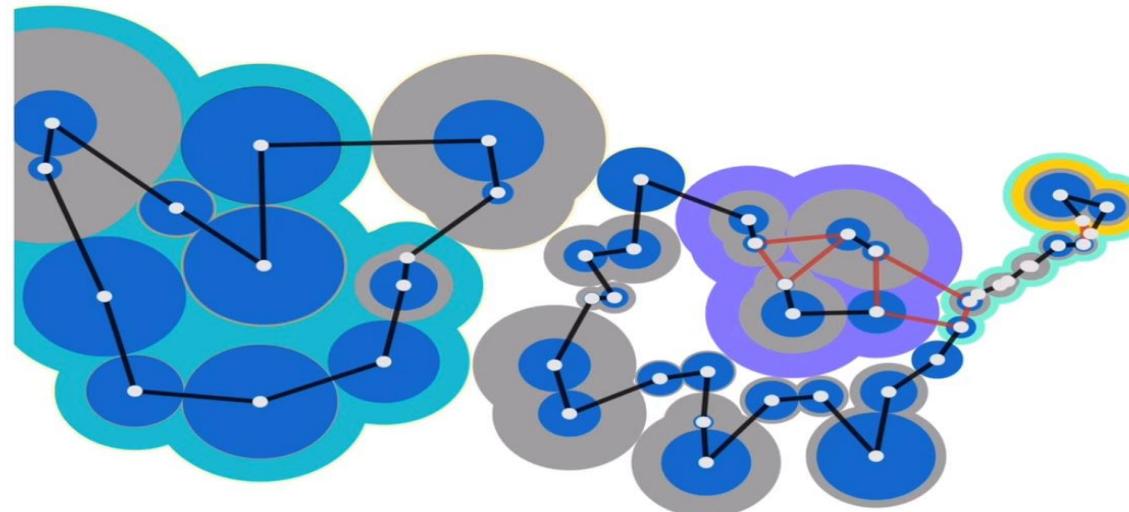
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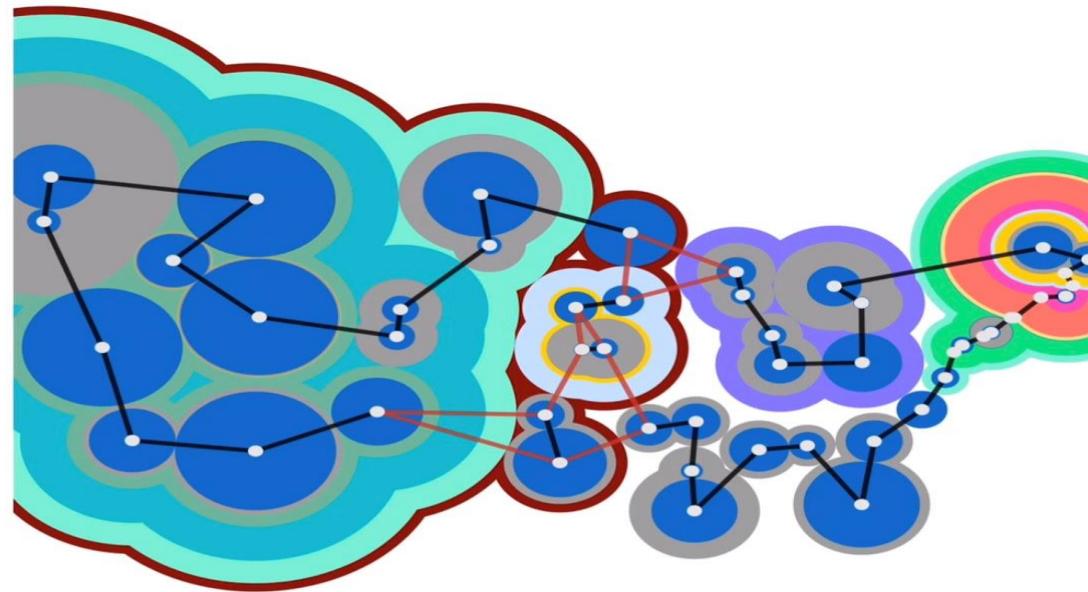
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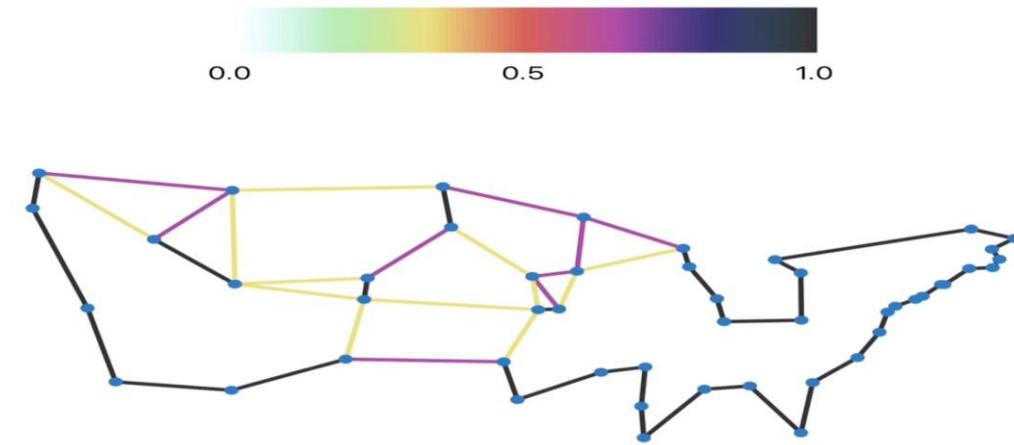
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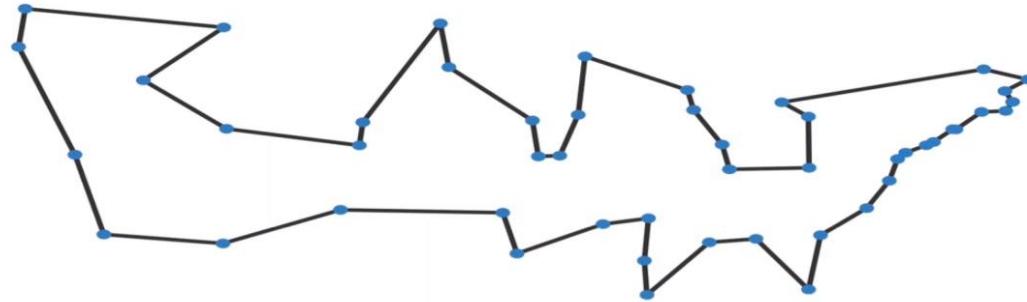
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Data Processing

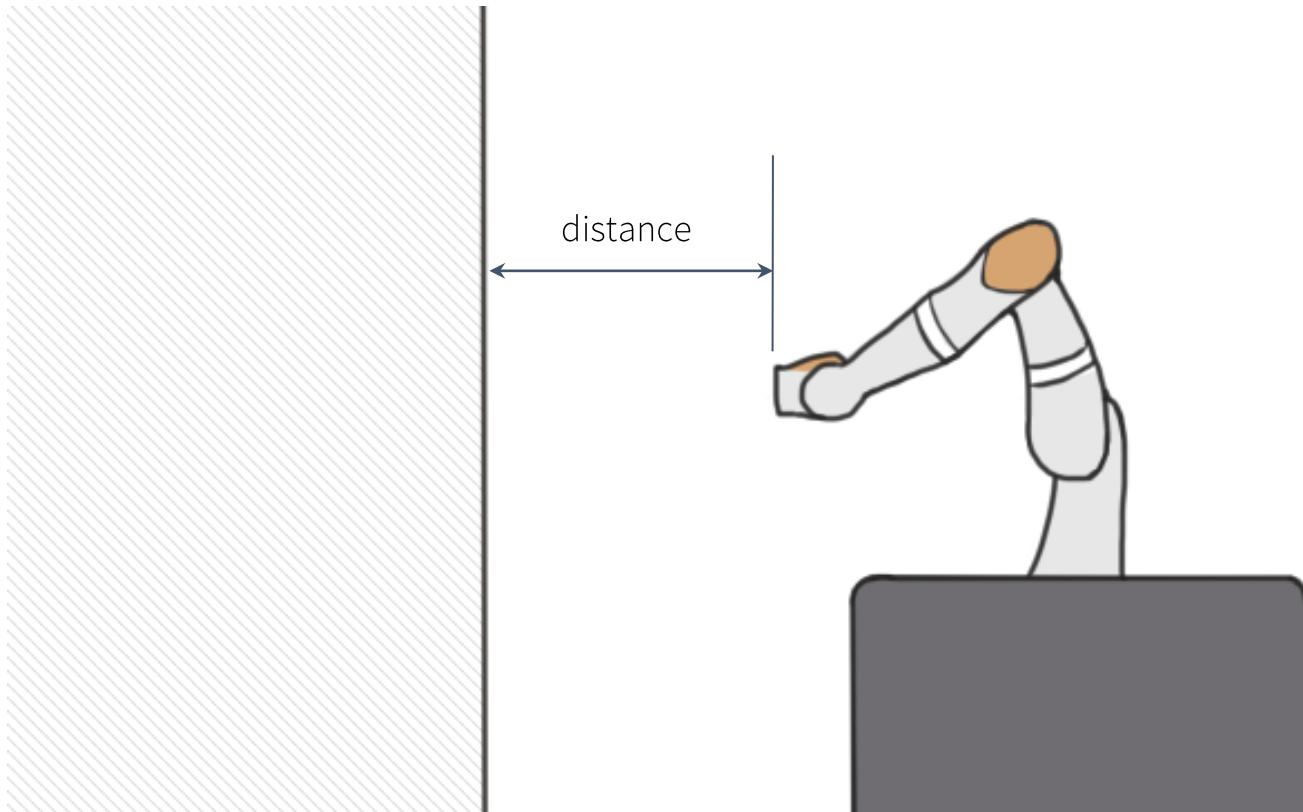
- Add more drawing points in-between the connected TSP nodes for smooth robotic motion
- Separate the drawing points into subsections





Data Processing

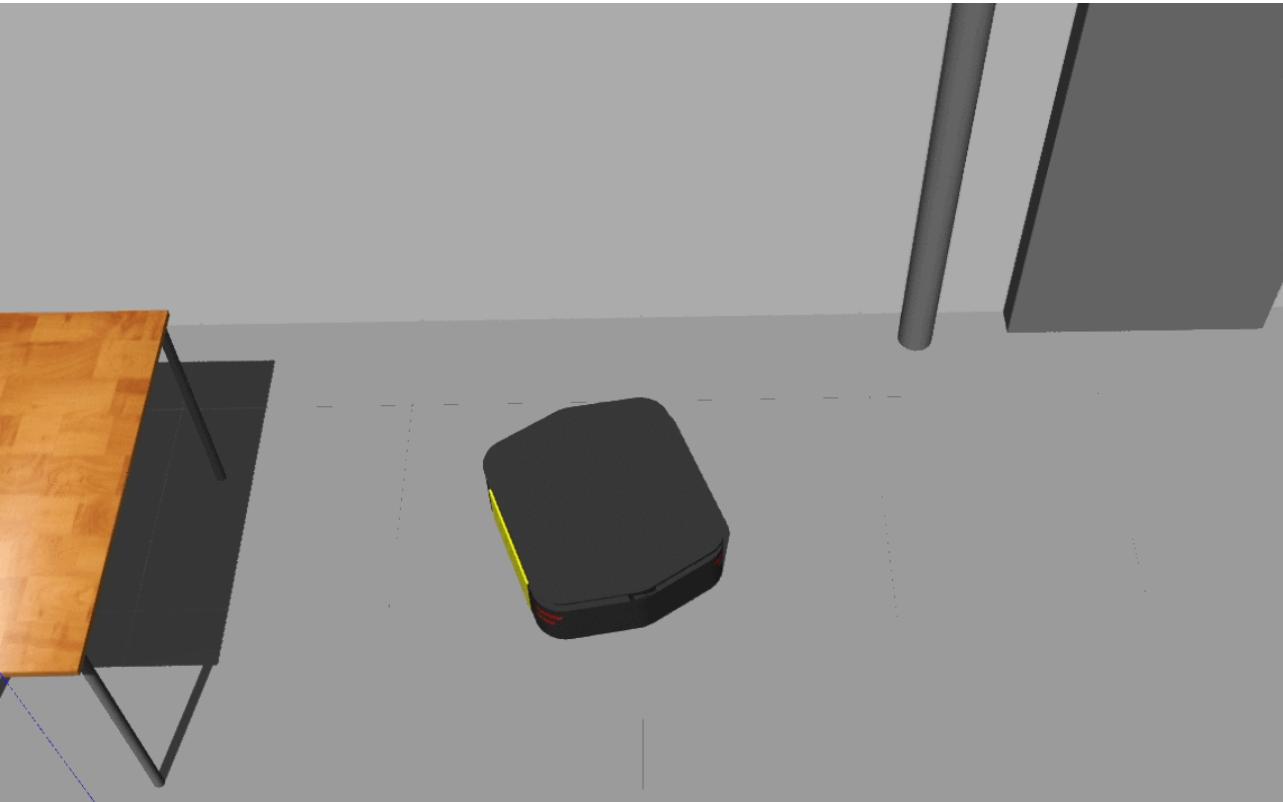
- Manipulator needs 3D paths as a necessary input trajectory
 - Expand the 2D path to 3D by adding the wall-distance from the robot





Robotic Drawing

- Orienting Robot toward the Canvas
 - Align the mobile base using the laser scanner





Robotic Drawing in Fastforward





Results

- Implementation Details

HW

KUKA IIWA 7 R800 (Manipulator)

Clearpath Robotics Ridgeback (Mobile base)

SW

Robot Operating System

Python Imaging Library (Pilow) for image processing

Concorde TSP Solver for solving TSP





Results

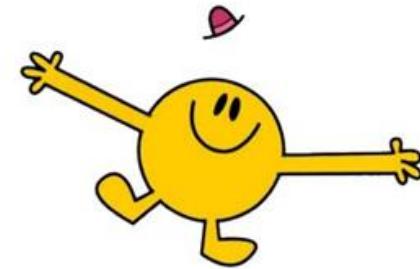
Original



Drawing Result



Heart

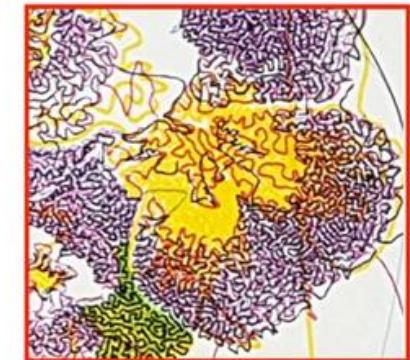


Character



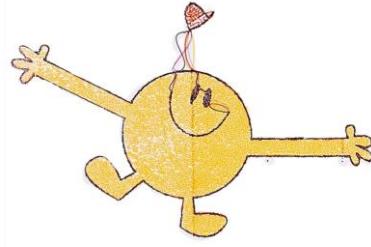
Flower

Detail





Results



	Heart	Character	Flower
Canvas Size (m)	0.40×0.35	0.60×0.40	0.85×0.30
Number of Points used for Stippling	34,849	31,151	95,155
TSP Time	6 min	36 min	97 min
Drawing Time	120 min	110 min	585 min



Conclusion

- Draw diverse images with Voronoi stippling and TSP Art
- Robotic drawing on large surfaces



Limitations and Future Work

1. Inaccurate Positioning

- Localizing using robot vision

2. Minimal Human Intervention

- Automated pen-switching

3. Diverse Drawing Style



Acknowledgement

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감사합니다

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