

Dynamic Closest Color Warping to Sort and Compare Palettes

SIGGRAPH 2021

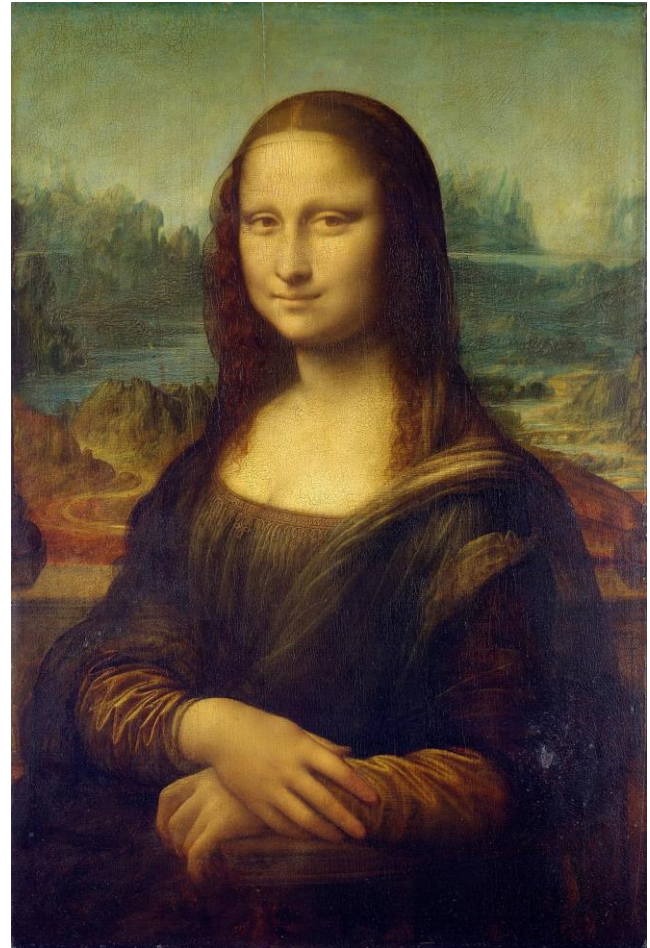
SUZI KIM and SUNGHEE CHOI, KAIST, Republic of Korea



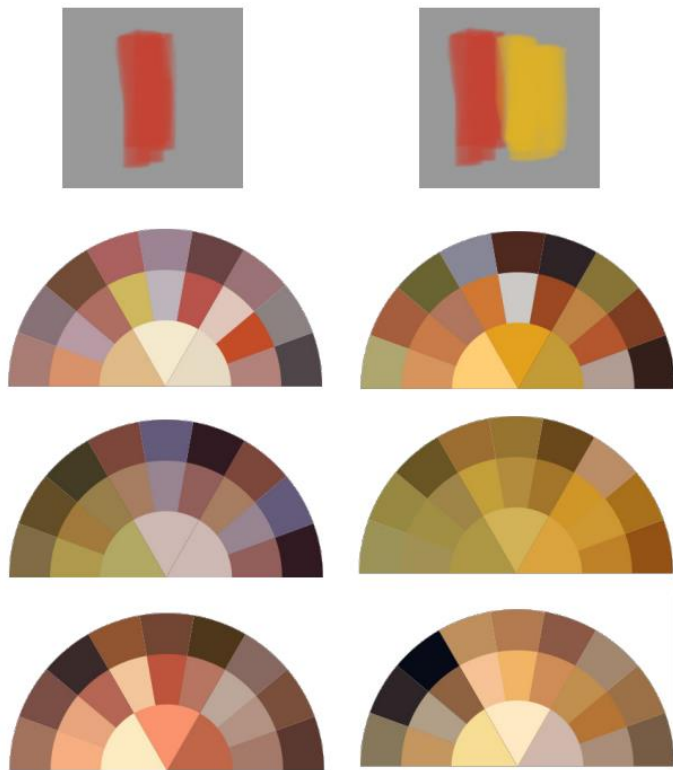
Why do we need a palette?



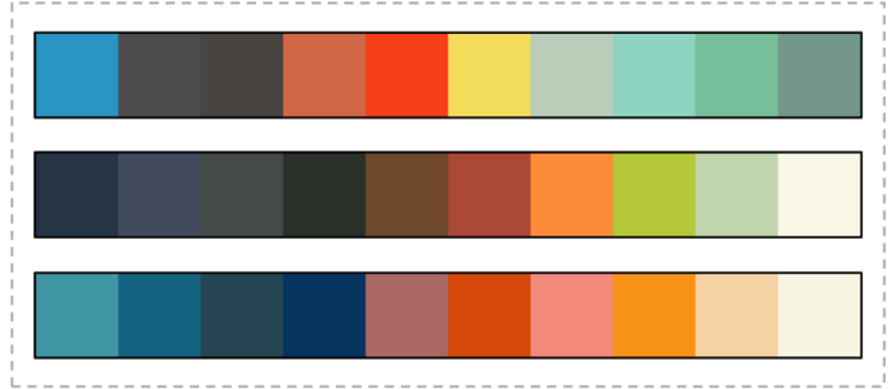
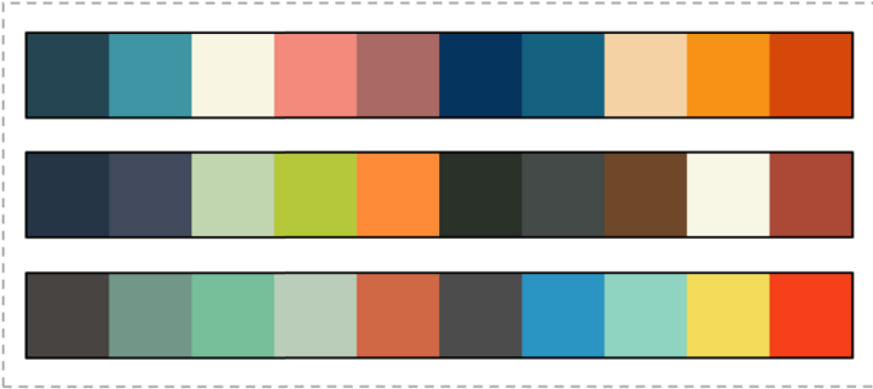
Why do we need a palette?



Why do we need a palette?



Why do we need to sort a palette?



- Easily create good palettes without professional art skills
- Find color trendings in random combination of colors

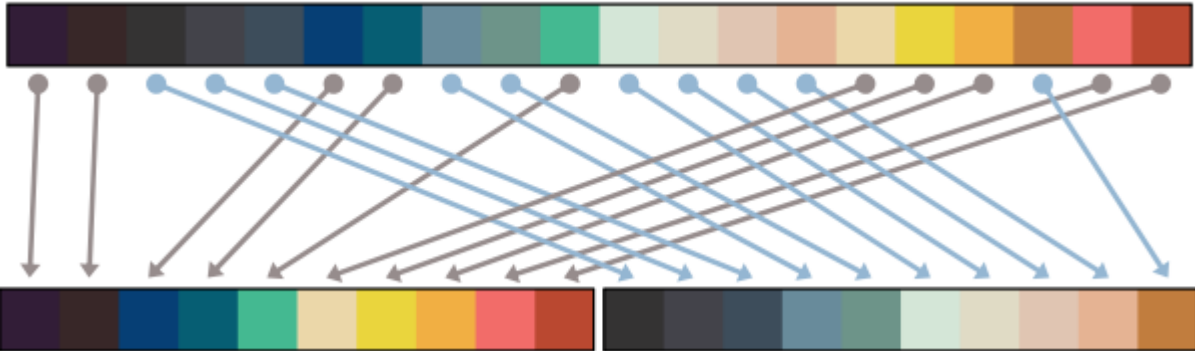
What's the problem to sort a palette?



- How do you define a *good color trending*?

- What's the *distance* between 2 colors?

- Can we separate several palettes from a bunch of colors?



What we want:

Visual Plausibility

Palette Creation

Palette Sorting

Palette Separation

Inner Structure of Colors

Fun Application

What we don't want:

Image Compression

Neural Network

Boring Evaluation

Single Palettes Sorting

Single Palette Sorting

“Nature Order of Colors”:

- CIELAB* color space

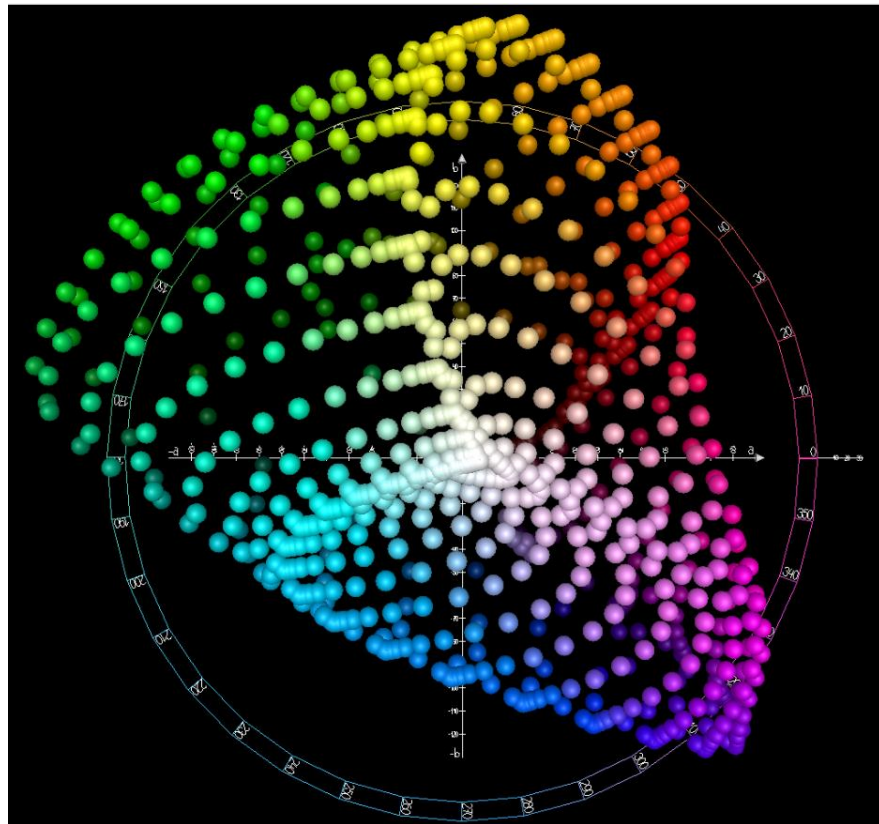
L*: Luminance

a*: Red and Green

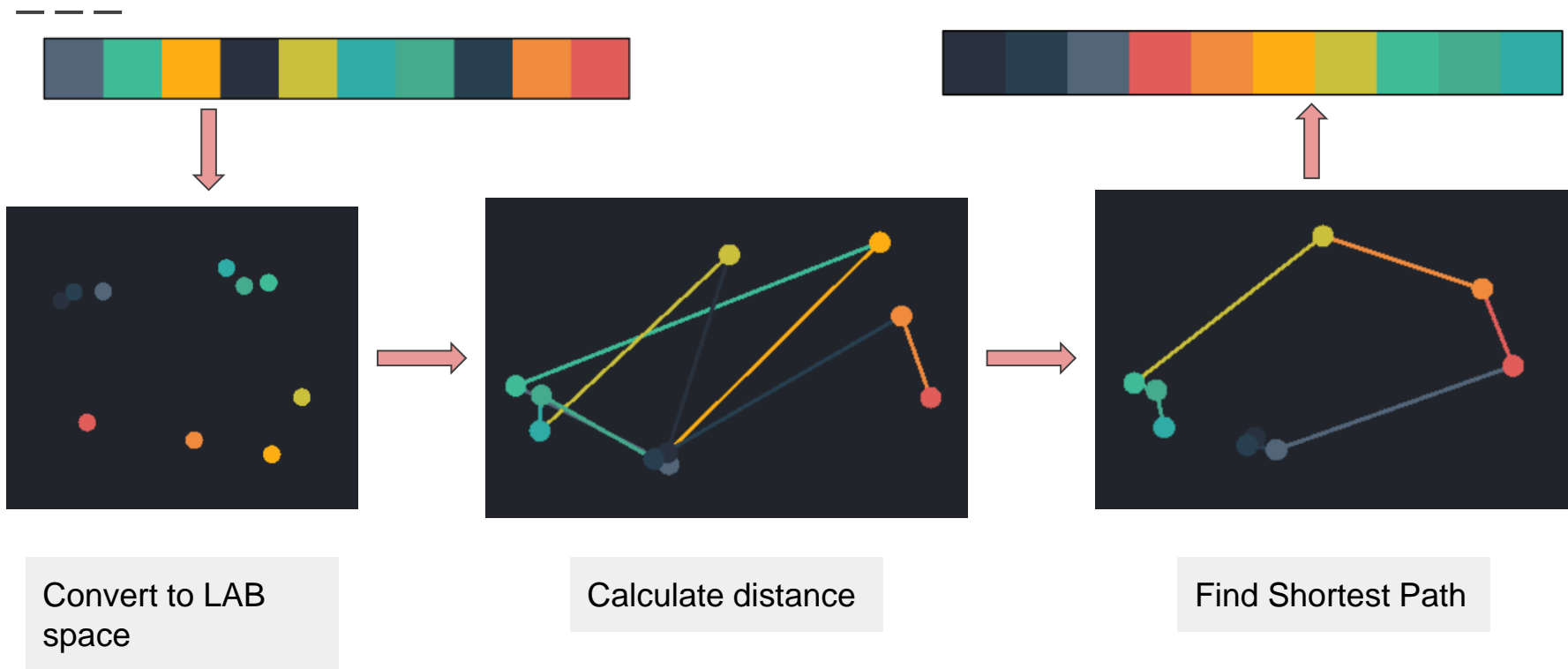
b*: Blue and Yellow

CIELAB colorspace is a device independent,
“standard observer” model

Reference: [Math](#) | [EasyRGB](#)



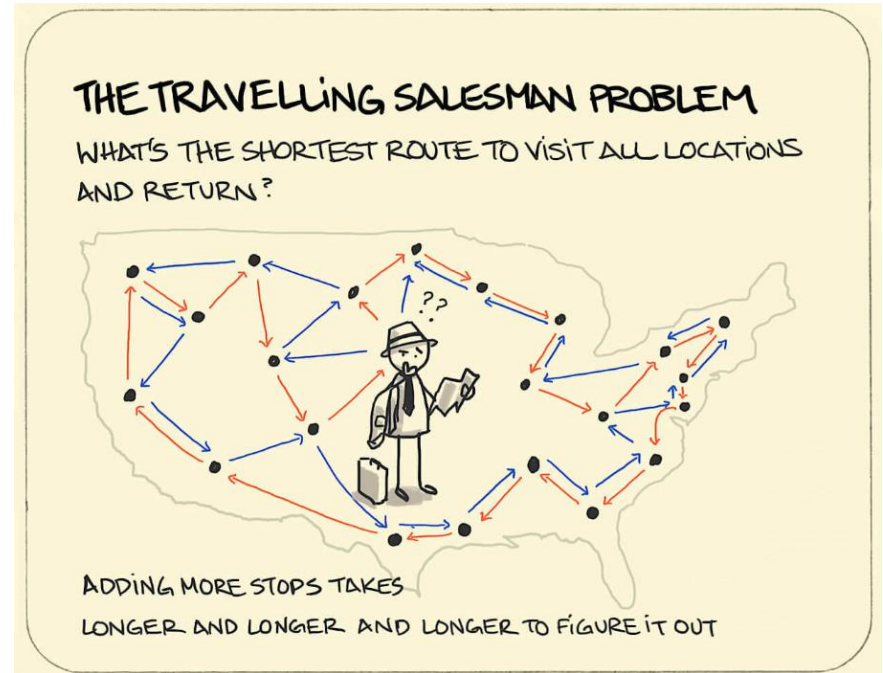
Single Palette Sorting



Solving Traveling Salesman Problem

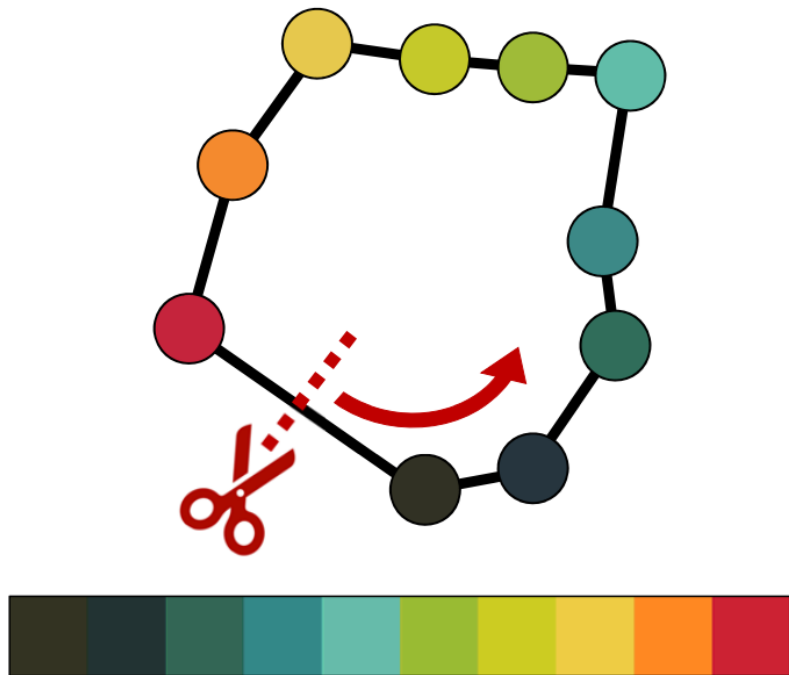
Old classic problem from 1930, but still under intensive studying...

- Iterate through all solution? $O(n!)$
- Held-Karp Algorithm(Dynamic Programming)
- Genetic Algorithm
- Annealing
- Lin-Kernighan heuristic 👍



Single Palette Sorting

1. Locate color point in CIELAB space
2. Calculate distance between colors
3. Symmetric Traveling Salesman Problem
4. Cut the longest edge to flatten the loop into a palette



Single Palette Sorting is Good Enough?

Our result:



Looks good, but...

Single Palette Sorting is Good Enough?

Our result:



Looks good, but...

Useful palette in real world is not a single flatten row, but an array



Single Palette Sorting is Good Enough?

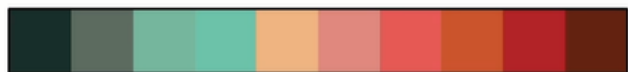


1. Plenty of colors categorized into multiple columns
2. Colors in Every column is well sorted
3. Color trendings in each column is similar



Two Palettes Sorting

Two Palettes Sorting



Two Palettes Sorting



a. Both well sorted

b. Similar color trending

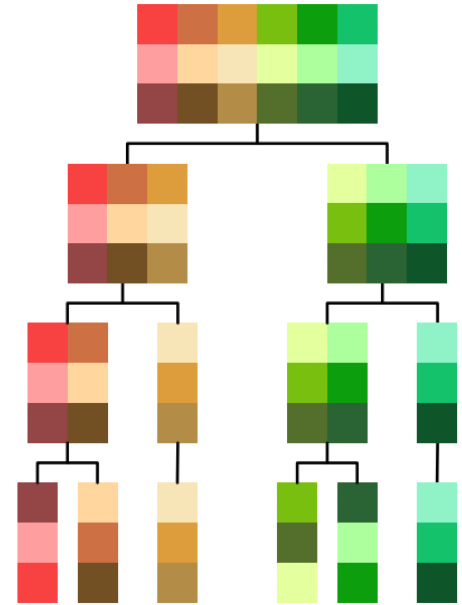
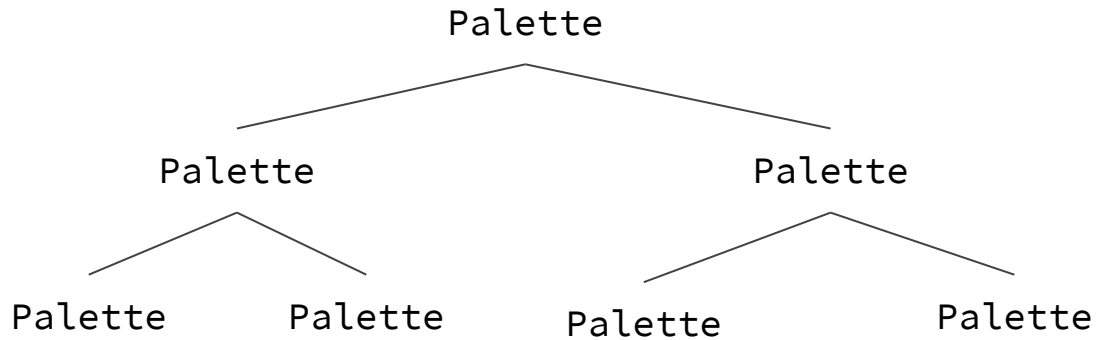
Two Palettes Sorting

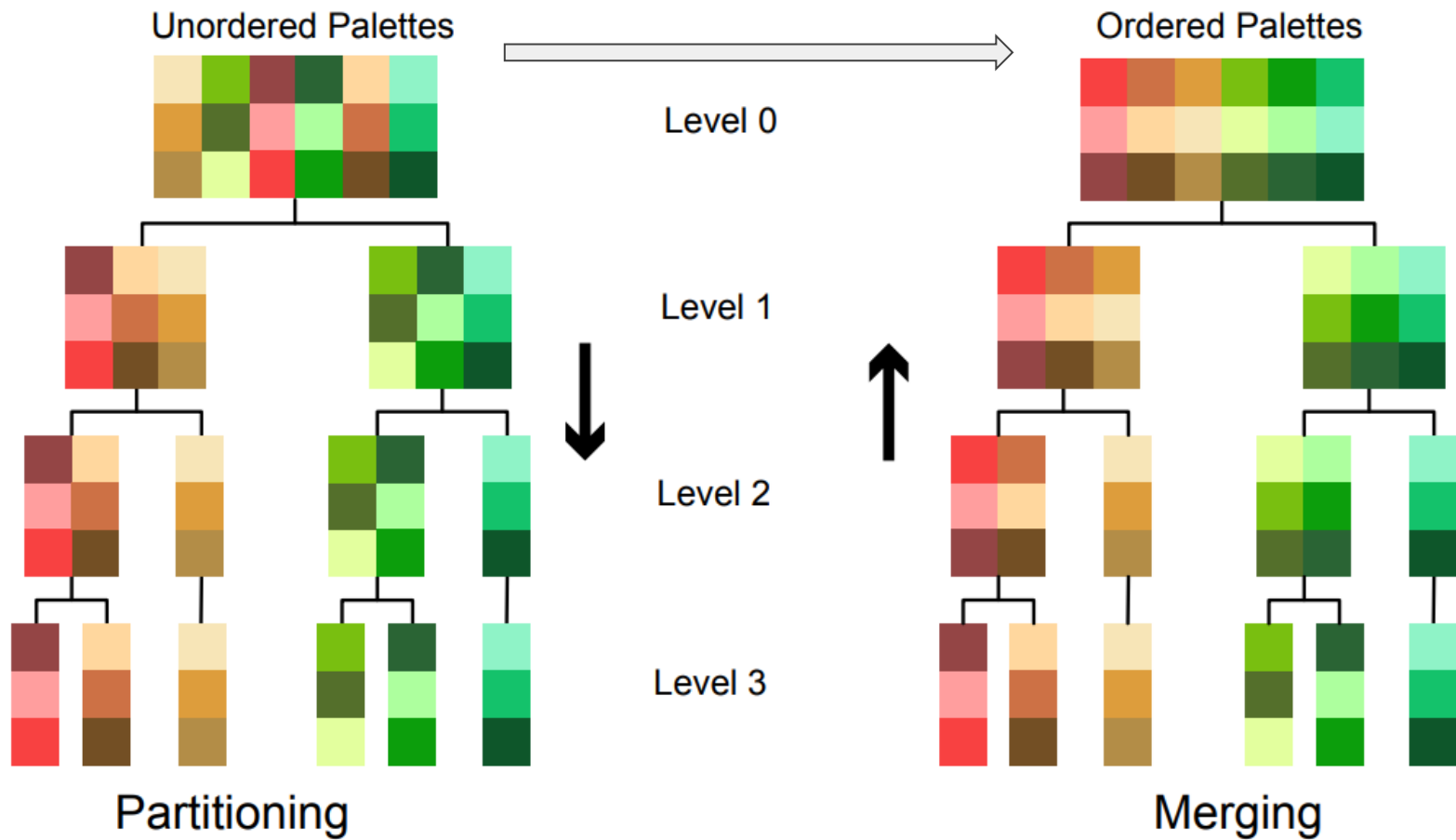
Why do we need to sort two palettes?

Two Palettes Sorting

Why do we need to sort two palettes?

Merge 2 palettes = Merge infinite palettes





Unordered Messy Colors



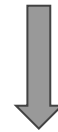
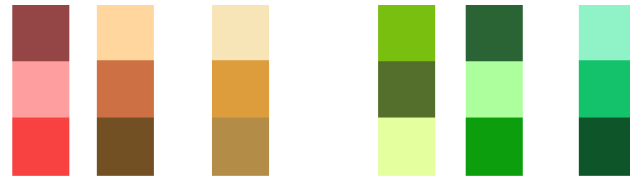
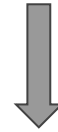
Lots of little Palettes



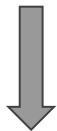
Ordering little Palettes



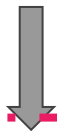
Beautiful Big Palettes



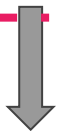
Unordered Messy Colors



Lots of little Palettes

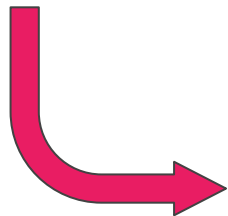


Ordering little Palettes



Beautiful Big Palettes

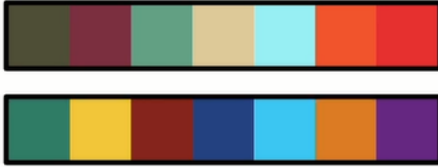
Two Palettes Sorting



Two Palettes Sorting

1

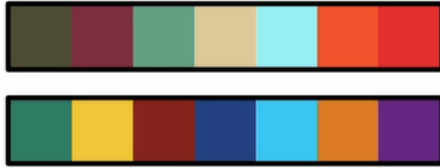
Two Palettes



Two Palettes Sorting

1

Two Palettes



2

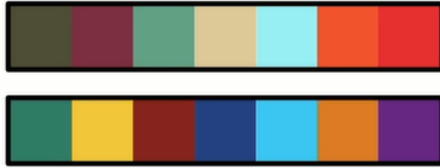
Merged Palettes



Two Palettes Sorting

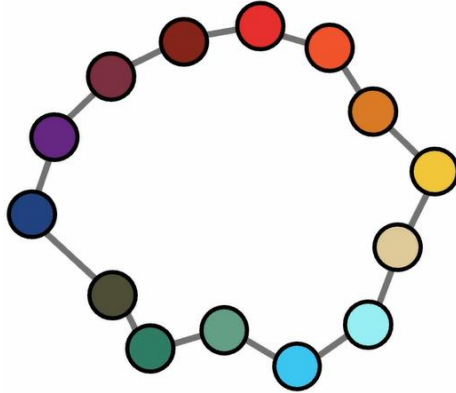
1

Two Palettes



2

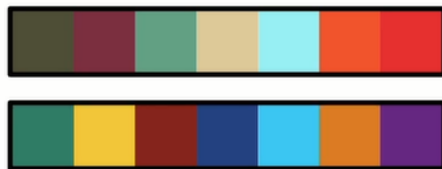
Sorted Palettes



Two Palettes Sorting

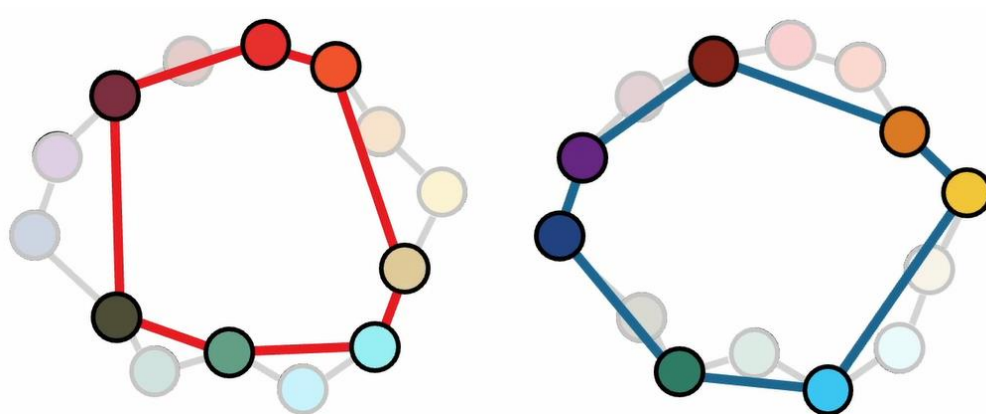
1

Two Palettes



2

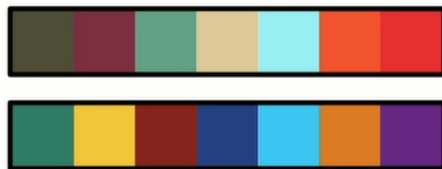
Sorted Palettes



Two Palettes Sorting

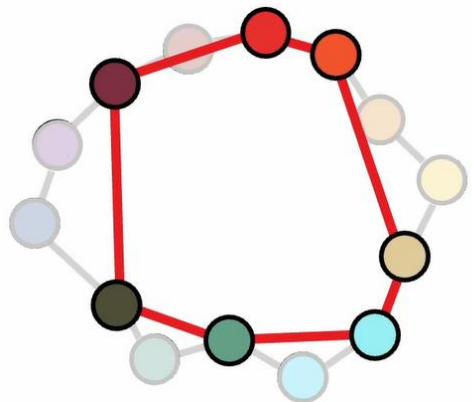
1

Two Palettes

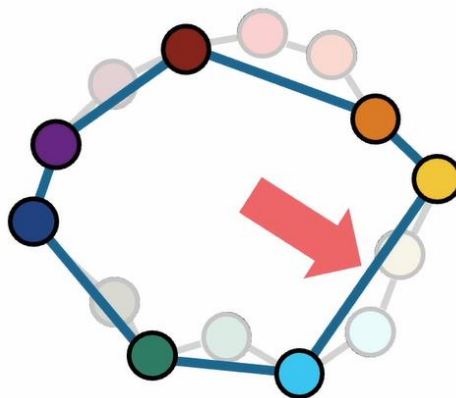


2

Sorted Palettes



3



Find the longest edge connecting the same palette colors

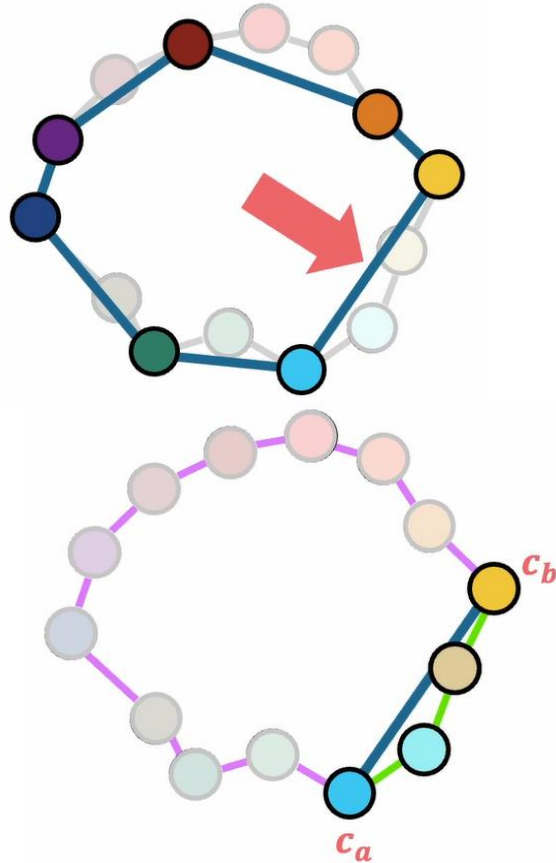
Two Palettes Sorting

3

Find the longest edge connecting the same palette colors

4

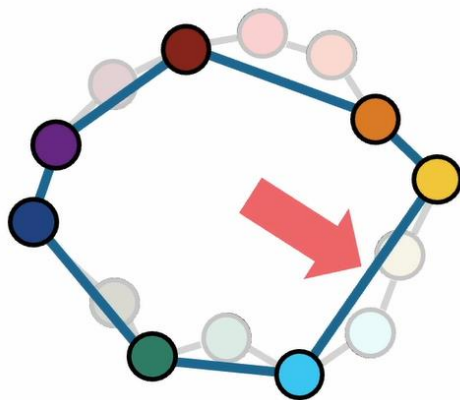
Choose the subpath with fewer vertices



Two Palettes Sorting

3

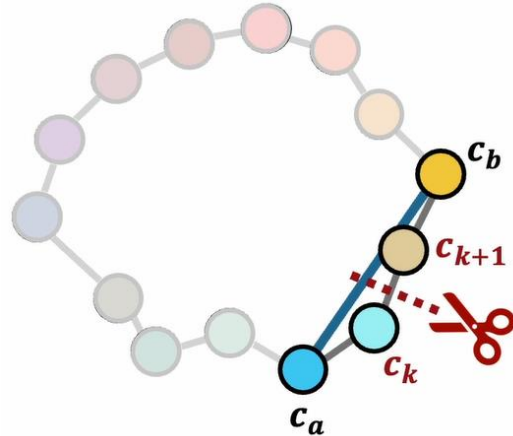
Find the longest edge connecting the same palette colors



4

Choose the subpath with fewer vertices, and find a cut point

$$\min_{i \in (a,b)} \left\{ \sum_{i=a+1}^k d(c_a, c_i) + \sum_{i=k+1}^{b-1} d(c_b, c_i) \right\}$$

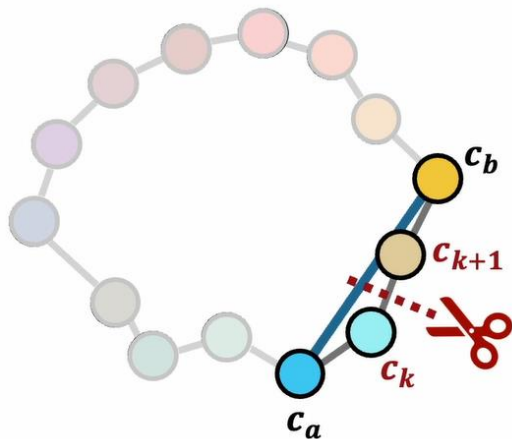


Two Palettes Sorting

4

Choose the subpath with fewer vertices, and find a cut point

$$\min_{i \in (a,b)} \left\{ \sum_{i=a+1}^k d(c_a, c_i) + \sum_{i=k+1}^{b-1} d(c_b, c_i) \right\}$$



5

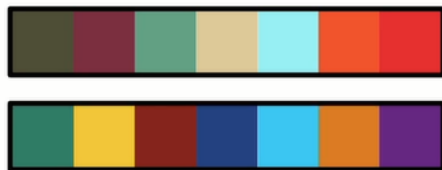
Flatten into sorted palette



Two Palettes Sorting

1

Two Palettes



5

Flatten into sorted palette



Two Palettes Sorting

1

Two Palettes



Different size



5

Flatten into sorted palette



Two Palettes Sorting

1

Two Palettes



Different size



5

Flatten into sorted palette



More than 2 palettes

Application

Palette Interpolation

Random Colors



Sorted Colors



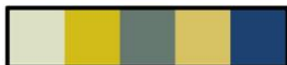
Interpolation



A Good Palette



Palette Extraction



Palette Transfer



Palette Transfer



Source



Target



Sorted Target



Adjusted Target



Palette Transfer



Source



Target



Sorted Target



Adjusted Target



My Implementation

Fun Palettes



An application to:

1. Visualize color space
2. Edit and adjust color palette
3. Color palette sorting
4. Save and load palette
5. Create palette from several color

What I expect further:

1. Better methods on solving TSP
2. Palette extraction and transfer from image

Thank You!