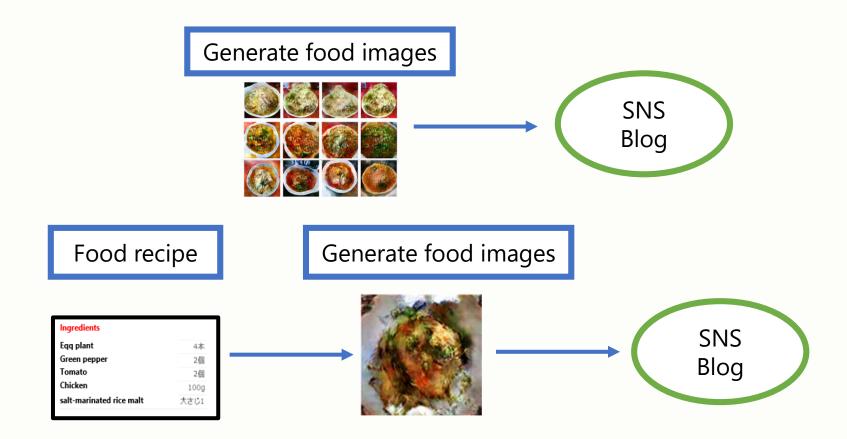
Food Image Generation using A Large Amount of Food Images with Conditional GAN: RamenGAN and RecipeGAN

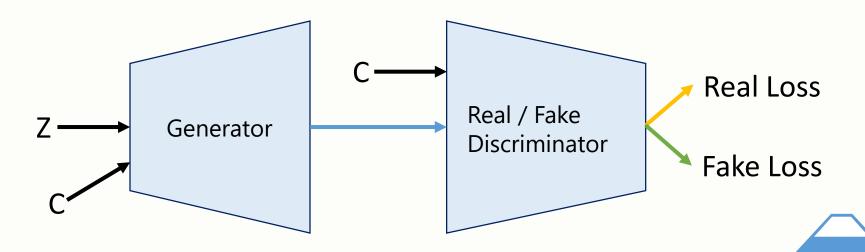
Yoshifumi Ito, Wataru Shimoda, Keiji Yanai The University of Electro-Communications, Tokyo, Japan

Objective



Method

- Conditional GAN [Mirza et al. arXiv 2014]
 - input
 - Random vector z
 - Condition vector c
 - Output
 - Generated image which is specific for condition vector c



Conditional GAN with WGAN-GP

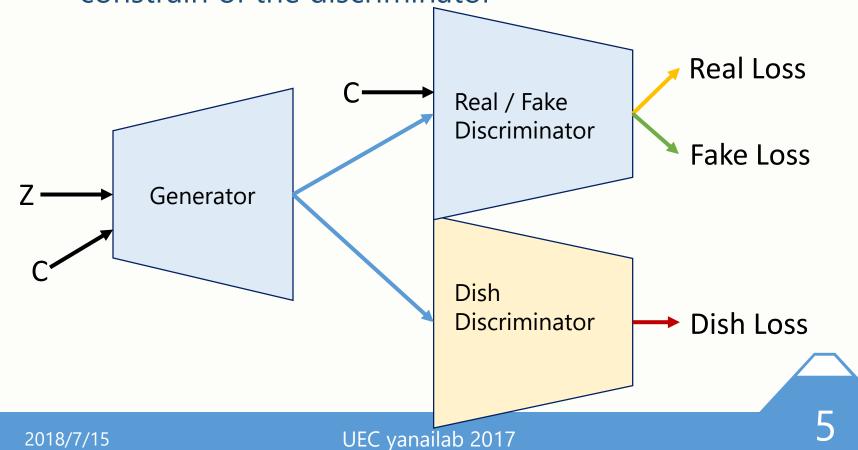
- WGAN [Arjovsky et al. arXiv 2017]
 - Minimize Wasserstein distance
- WGAN-gp [Gulrajani et al. arXiv 2017]
 - Generate High quality image
 - Reduce training of computational cost of WGAN
- Loss function

$$L_D^{CWGAN-GP} = \mathbb{E}[D(x|c)] - \mathbb{E}[D(G(z|c))] +$$
$$\lambda \mathbb{E}[(|\nabla D(\alpha x - (1 - \alpha G(z|c)))| - 1)^2]$$

$$L_G^{CWGAN-GP} = \mathbb{E}[D(G(z|c))]$$

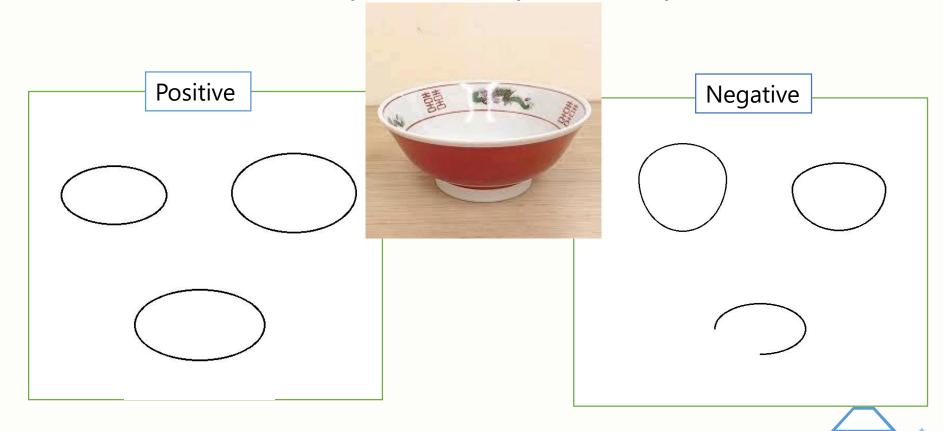
Improved c-GAN: Discriminator of dish plate

- We use a discriminator for dish plate outline
 - Dish plates of generated images will be round by the constrain of the discriminator



Discriminator of dish plate outline

Learn the concept of dish plate shape



Experimental data

Ramen Dataset

Target category	Image number
Plane ramen	790
Jiro ramen	5,901
lekei ramen	2,836
Spicy ramen	3,578
Taiwan ramen	1,567
Onomichi ramen	1,228
total	15,900





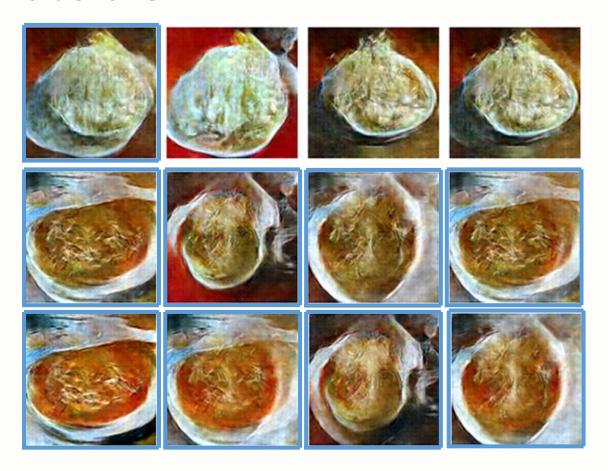








- Ramen GAN
 - Conditional GAN



- Ramen GAN
 - WGAN-GP+Discriminator of dish plate

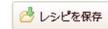


Experimental data

- Cookpad dataset has 500k recipes.
 - We used several ingredient categories which is frequently used.



豚の角煮





煮れば煮るほどやわらかくなります。しかも 余分なあぶらもとれるので、ヘルシーかもし んない。時間はかかるけど、おいしいよ。



材料 (4人分)

しょうが	お好みで
ニンニク	お好みで
ねぎ	1本
豚肉	バラのブロック 2 パック
砂糖	小さじ1から2くらい
酒	たくさん(安い日本酒でいい)
醤油	適量(味見しながらね)
みりん	大さじ3くらい

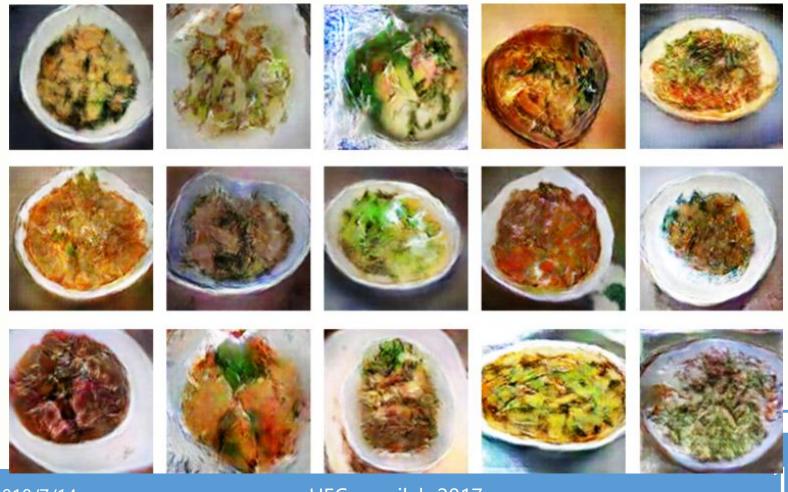
- Recipe GAN
 - Conditional GAN



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11

- Recipe GAN
 - Conditional GAN+WGAN-GP



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2

- Recipe GAN
 - CGAN+WGAN-GP+ Dish plate disicriminator



Specific food category image generation
Category Generated images



14

Image retrieval using generated image

Image retrieval with generated image and category name

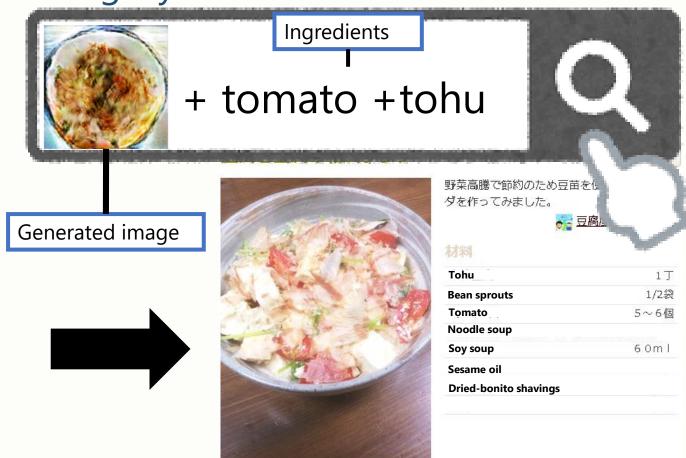


Image retrieval using generated image

Query image



Tomato+Chicken



Conclusion and future work

Conclusion

- Food image generation using conditional GAN
 - Ramen GAN
 - Recipe GAN
- The dish plate discriminator and WGAN-GP are effective for food image domain
- Future work
 - improvement of further quality
 - clean up dataset
 - Dividing current category into more detailed category
 - Numerical results