





Food Interpolation using GANs

Main Idea

- Food dataset with labels
- Train GANS with auxiliary classifier
- Interpolate between Burger  and Pizza 



Initial Setup

- Dataset: Food 101
- GAN setup from WGAN-GP paper
- Use auxiliary classifier to encode classes
- GPU: GeForce GTX 1080 Ti (11GB Mem.)

| Generator $G(z)$ | | | |
|------------------|-------------------------|----------|---------------------------|
| | Kernel size | Resample | Output shape |
| z | - | - | 128 |
| Linear | - | - | $128 \times 4 \times 4$ |
| Residual block | $[3 \times 3] \times 2$ | Up | $128 \times 8 \times 8$ |
| Residual block | $[3 \times 3] \times 2$ | Up | $128 \times 16 \times 16$ |
| Residual block | $[3 \times 3] \times 2$ | Up | $128 \times 32 \times 32$ |
| Conv, tanh | 3×3 | - | $3 \times 32 \times 32$ |

| Critic $D(x)$ | | | |
|-----------------|-------------------------|----------|---------------------------|
| | Kernel size | Resample | Output shape |
| Residual block | $[3 \times 3] \times 2$ | Down | $128 \times 16 \times 16$ |
| Residual block | $[3 \times 3] \times 2$ | Down | $128 \times 8 \times 8$ |
| Residual block | $[3 \times 3] \times 2$ | - | $128 \times 8 \times 8$ |
| Residual block | $[3 \times 3] \times 2$ | - | $128 \times 8 \times 8$ |
| ReLU, mean pool | - | - | 128 |
| Linear | - | - | 1 |

First Results

- Iterations: 16.000
- Resolution: 64 x 64
- Batch Size: 256





Issues

- Results with a lot of artifacts
- Weird patterns
- Bad colors
- Dataset not well suited for GANs!

→ Download images from Google



790432.jpg



790841.jpg



792093.jpg



796922.jpg



799874.jpg



800546.jpg



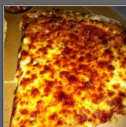
803243.jpg



807128.jpg



809024.jpg



812349.jpg



816577.jpg



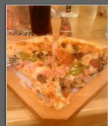
816729.jpg



819547.jpg



823104.jpg



829229.jpg



833711.jpg



835833.jpg



837119.jpg



839461.jpg



849291.jpg



852436.jpg



853441.jpg



857888.jpg



861771.jpg



863509.jpg



866834.jpg



868789.jpg



869763.jpg



1 Eq_k-na_pizza-margherita_sep2005...



2.55cd28ca8ee78fe1e52ab1adc9eaf...



3 pizza-margherita.jpg



4.pizza368_v-contentgross.jpg



5.pizza_fresca.jpg



6.Asset_817968.jpg



7.delish-keto-pizza-073-1544039876.j...



8.pizza-3.jpg



9.pizza_left.png



10.rez-edeka-pizza-funghi-rezept-i-p-r...



11.4282-pizza-margherita.jpg



12.BFV36537_CC2017_zingredintDou...



13.pizza-3000274_1920.jpg



14.Pizza%20Margherita.jpg



15.der-beste-pizzateig.jpg



16.pizza-bild.jpg



17.pizza-chicken-hollandaise.jpg



18.1200px-Greek_pizza_%281%29.jpg



19.bildschirmfoto_2018-11-19_um_16...



20.mono_share_main_01-e1549836...



21.b0f02e58-2b4e-4a26-ad8b-30e16...



22.pizza-pizzateig-selber-machen-cc0...



23.product_images_350x350_product...



24.123651-pizza-gorgonzola-feige-0.jpg





167971.jpg



169191.jpg



169479.jpg



170292.jpg



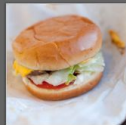
172005.jpg



175584.jpg



177522.jpg



177861.jpg



178840.jpg



179593.jpg



184751.jpg



184955.jpg



193622.jpg



201200.jpg



204552.jpg



209001.jpg



210405.jpg



212746.jpg



214437.jpg



214601.jpg



215037.jpg



215349.jpg



216853.jpg



217855.jpg



65. anne-burrell-killer-turkey-burger-t...



66. Schweinebauch-Bacon-Burger.jpg



67. mio_rezepte_1117_0051_v4_121-5...



68. gua-bao-burger.jpg



69. anamma_vegan_burger_coleslaw.j...



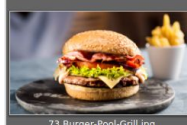
70. Best-Burger-4.jpg



71. exps28800_UG143377D12_1b_1b...



72. 3c420211b492cb5cbb1d88d4-750...



73. Burger-Pool-Grill.jpg



74. 190524-classic-american-cheeseb...



75. burger-rezept-img-151108.jpg



76. RP04_24_05_halloumiBurger_Title...



77. 17980-suesse-fruechte-burger.jpg



78. 151638762-f3_2-w-960.jpg



79. burger-bild.jpg



80. lecker_muss_es_sein_10-2017_-Bu...



81. Asian-Sticky-Belly-Pork-Burger-wit...



82. So-schmeckt-der-neue-Vegan-Bur...



83. DSC_0127ed2.jpg



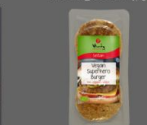
84. 20150728-homemade-whopper-to...



85. burger-rezepte.jpg



86. Burger_680x453px.jpg



87. 1cddcb3c1273ff86644d2be1c52c2...



88. Hamburger_%28black_bg%29.jpg



89. burger-double-cap.png



90. 2015-07-swiss-burger.jpg



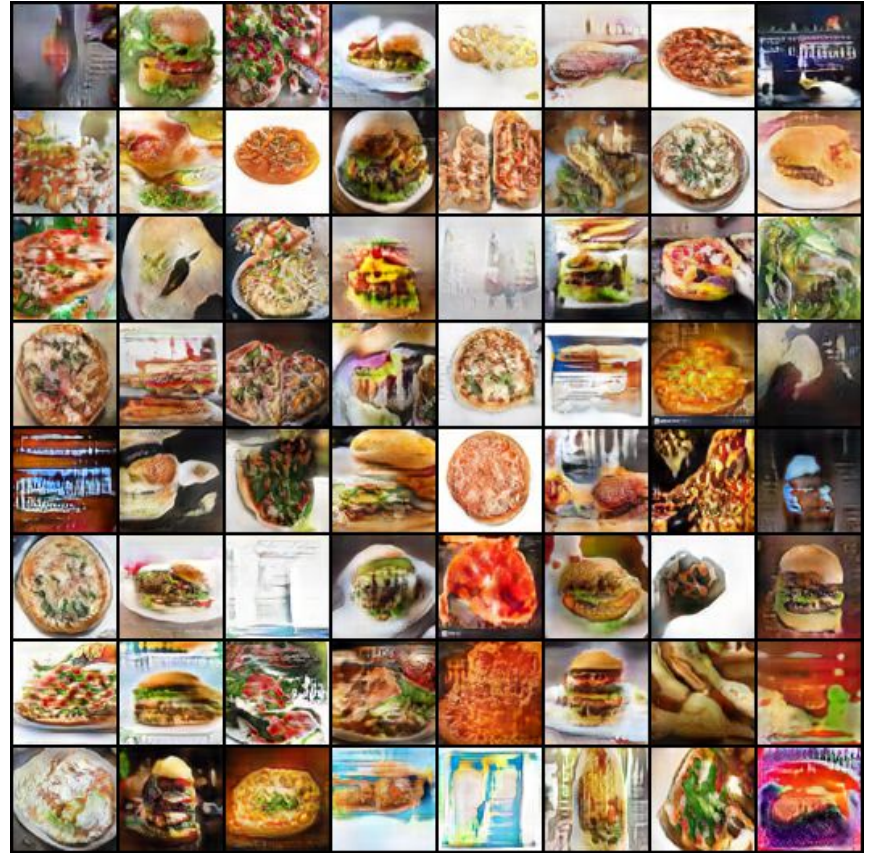
91. burger-buns-selber-machen-850x...



92. 16_463_klassiker_deluxe_app_pro...

Second Results

- Iterations: 16.000
- Resolution: 64 x 64
- Batch Size: 256



First Interpolations



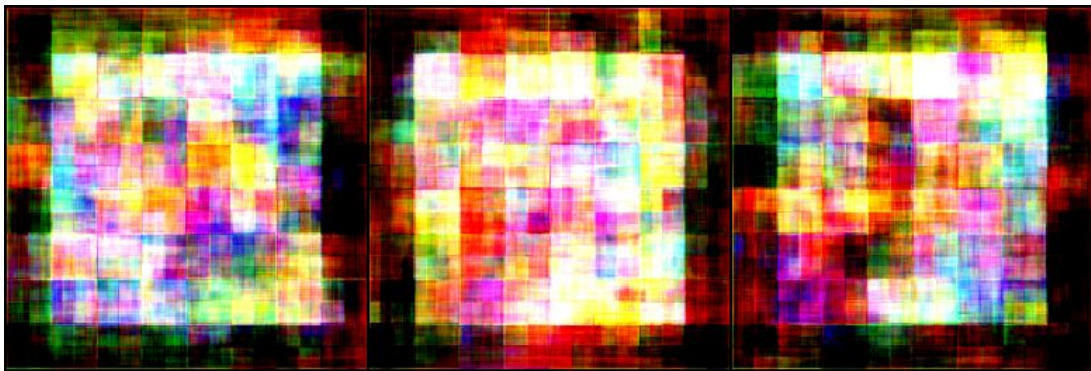
First Interpolations

Lets go big !



Third Results

- Iterations: < 10.000
- Resolution: 256 x 256
- Batch Size: 16





Solution

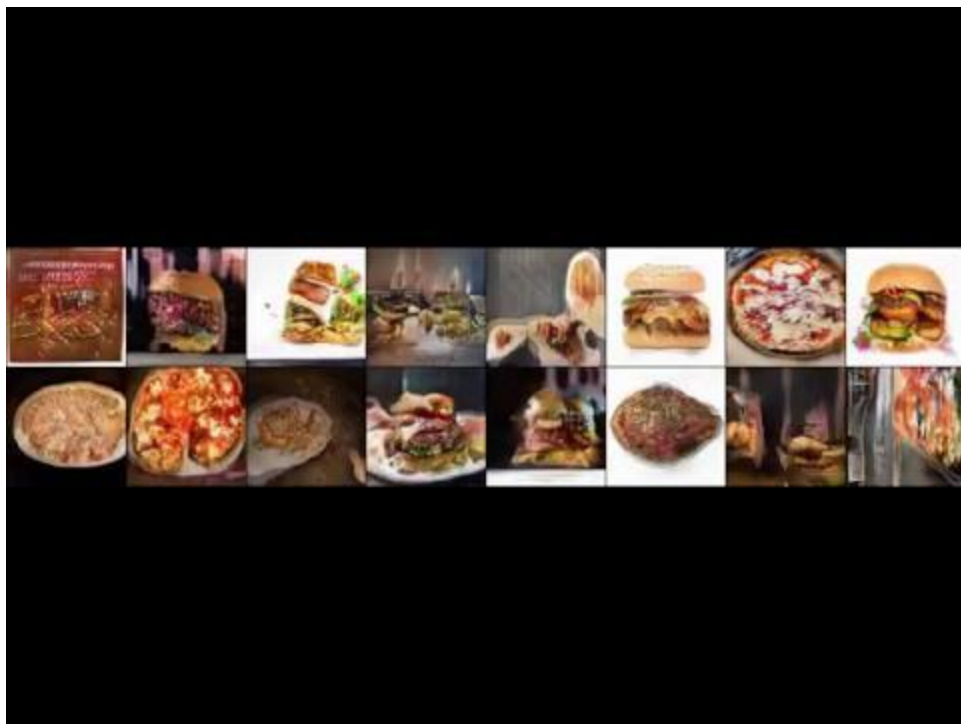
- Use progressive growing GAN architecture
 - Start with 4x4
 - Train 50 epochs stabilizing
 - Upscale
 - Train 50 epoch fade-in
 - Repeat!

Fourth Results

- Epochs: 700
- Res.: 256 x 256



- Adaptive Batch Size:
 - 4x4 → 1024, 8x8 → 1024, 16x16 → 512, 32x32 → 256,
64x64 → 128, 128x128 → 50, 256x256 → 30



Interpolations

