## Typography Style Transfer

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### **TYPEFACE WEIGHTS**

Roboto Thin

Roboto Light

Roboto Regular

**Roboto Medium** 

**Roboto Bold** 

**Roboto Black** 

Roboto Thin Italic

Roboto Light Italic

Roboto Italic

Roboto Medium Italic

**Roboto Bold Italic** 

Roboto Black Italic

True Bold



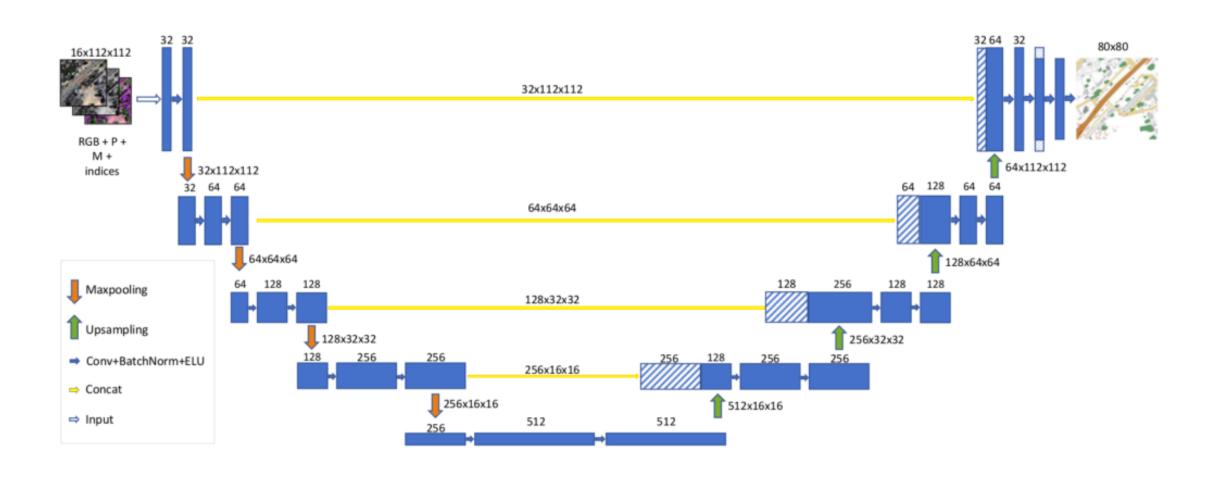
Faux Bold



#### DATASETS

- LATIN: 4000+ Open Source fonts from Google Fonts and FontSquirrel. 100 ASCII characters for each.
- CJK: Adobe/Google's Source Hans Sans & Serif. 65536 symbols in 6
  different weights and both sans and serif

## U-NET ARCHITECTURE



#### LABEL ALIGNMENT

Good Alignment **Bad Alignment** 

BOLD

## LIGHT

7	ΓRAIN		V	VALIDATION			TRAIN		VALIDATION	
X	γ*	Υ	X	γ*	Υ	Х	γ*	Υ	X Y* Y	_
9	9	9	X	X	X	•	•	•	XXX	
7	7	7	*	*	*	>	>	>	@ @ @	
~	~	~	е	е	е	К	К	К	X X X	
4	4	4	-	-	-	(	(	(	] ]	
Ν	Ν	Ν	b	b	b	n	n	n	<b>G</b> G G	
V	V	V	4	4	4	#	#	#	r r r	

BLACK

## **ITALIC**

TRAIN	VALIDATION	TRAIN	VALIDATION
X Y* Y	Х Ү* Ү	х ү* ү	Х Ү* Ү
<b>P P</b> P	} <b>}</b>	9 9 9	WWW
	I I I	b <i>b b</i>	N N N
1 <b>1</b> 1	> > >	H $H$	5 5 5
2 <b>2 2</b>	t <b>t t</b>	Y Y Y	G G G
I I I	L L L	j <i>j j</i>	w w w
$\circ$	& & &	9 9 9	2  2  2

## **BOLD SERIF KANJI**

## **BOLD SANS KANJI**

TRAIN	VALIDATION	TRAIN	VALIDATION
X Y* Y	X Y* Y	X Y* Y	X Y* Y
% %	恒惟惟	曇 曇 曇	閏 閏 閏
壧 壧 壧	蒯蒯	铙 <b>铙 铙</b>	<b>抁 抁</b>
双 双 双	都都都	<b>畫 畫</b>	楦 楦 楦
袴 袴	答 答 答	盃 <b>盃</b>	鵚 鵚 鵚
顀 顀 顀	蚼 蚼	勇 <b>勇 勇</b>	带 带
<b>開 開</b>	呉 呉 呉	戽戽戽	驤 <b>泉 齈</b>

## SERIF → SANS

## SANS --- SERIF

TRAIN	VALIDATION	TRAIN	VALIDATION
X Y* Y	X Y* Y	X Y* Y	X Y* Y
混混混	贸贸贸	檏 檏 檏	唠唠唠
蚕蚕蚕	瘘 瘘 瘘	郇郇	趜 趜 趜
趙 趌 趌	酜 酜 酜	獋 獋 獋	馬并 馬并 馬弁
均 坅 坅	笄 笄 笄	濯濯濯	<b>偽</b> 傷
赘 赘 赘	塞塞塞	抷 抷 抷	74 74 74
給 給	猯 猯	衬 袝 袝	夗 夗 夗

#### **EVALUATION**

#### **Dice Coefficient:**

- Training: >90%
- Validation: >85% (except italics)

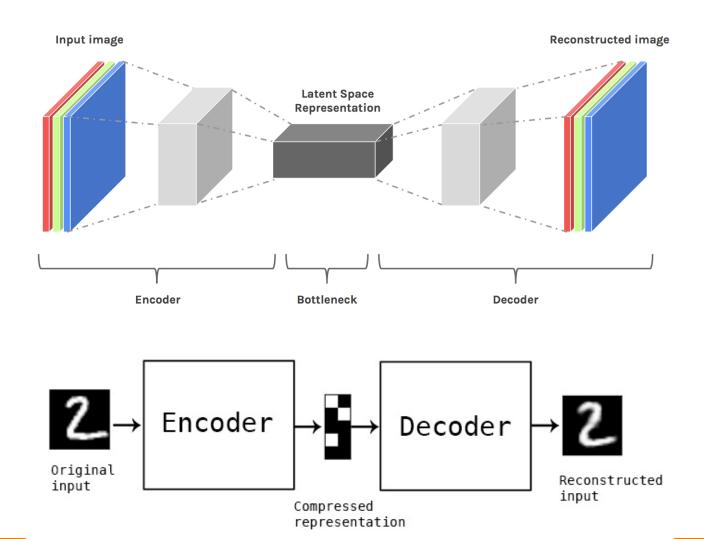
**Perception Test**: Subjects are presented with pairs of example and determine if they are a valid pair

- Training: >96%
- Validation: >90% (except italics)





## VARIATIONAL AUTOENCODER



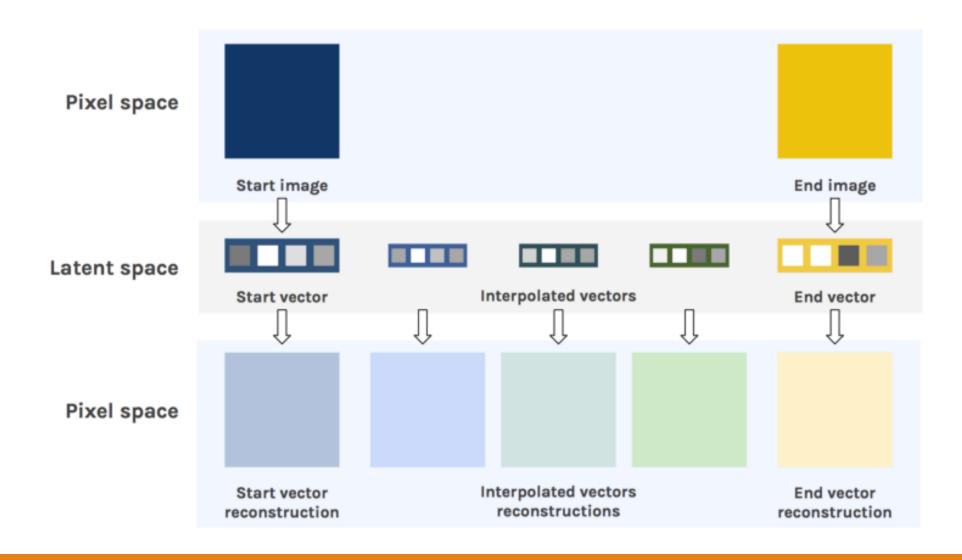
Α	В	C	D	Ε	F	G	Н	ı	J	K	L	Μ	N	Ο	Р
Α	В	C	D	Ε	F	G	Н	I	J	K	L	M	N	О	Р
Α	В	C	D	Е	F	G	Н	I	J	Κ	L	Μ	Ν	Ο	Р
Α	В	C	D	Ε	F	G	Н	I	J	Κ	L	М	Ν	Ο	Р
Α	R	C	ח	⊏	F	G	Н	1	- 1	К	1	٨٨	N	$\cap$	P
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A	$\mathcal{B}$	Ø	Ø	G	Ð	G	H	Ą	J	K	Ł	M	N	0	P
A	$\mathcal{B}$	C	D	$\epsilon$	7	Ğ	$\mathcal{H}$	I	0	K	L	M	$\mathcal{U}$	0	P
$\mathcal{A}$	$\mathcal{B}$	C	$\mathcal{D}$	${\cal E}$	$\mathcal{F}$	$\mathcal{G}$	$\mathcal{H}$	J	J	K	L	$\mathcal{M}$	$\mathcal{N}$	0	$\mathcal{P}$
$\mathcal A$	${\mathcal B}$	C	$\mathcal{D}$	${\cal E}$	$\mathcal{F}$	$\mathcal{G}$	$\mathcal{H}$	$\mathcal{J}$	$\mathcal{J}$	K	L	$\mathcal{M}$	$\mathcal{N}$	0	$\mathcal{P}$
A	$\mathcal{B}$	Ø	D	E	F	Ĵ	$\mathcal{H}$	Ì	J	K	Ł	M	$\mathcal{N}$	Ø	$\mathcal{P}$
$\mathcal{A}$	$\mathcal{B}$	C	$\mathcal{D}$	É	$\mathcal{F}$	$\mathscr{G}$	$\mathcal{H}$	T	J	K	$\mathscr{L}$	M	W	0	$\mathscr{P}$

A	В	C	D	E	F	G	H	ı	J	K	L	M	N	0	P
A	B	C	D	E	F	G	H	1	J	K	L	M	N	0	P
A	В	C	D	E	F	G	H	I	J	K	L	M	N	0	P
A	В	C	D	Ε	F	G	Н	I	J	K	L	M	N	0	P
A	В	C	D	E	F	G	Н	I	J	K	L	M	N	0	P
A	В	C	D	E	F	G	H	T	J	K	L	M	N	0	P

<b>I</b> III A	<b>     </b> B	<b>  </b>	<b>    </b>	<b>      </b> E	<b>∭</b> ∥ F	<b>    </b>	<b>     </b> H		J	<b>IIII</b>	<b>IIII</b>	<b>■</b>		<b>III</b> I
	<b>     </b> B	<b>  </b>	<b>    </b>     D	<b>      </b> E	<b>   </b>	<b>      </b> G	<b>      </b> H		J	<b>     </b> 		<b>I</b> ∭		<b>I</b> III P
<b>∥</b>	<b>                                     </b>	  C	<b>  </b>   D	<b> </b>   E	<b>  </b>   F	<b> </b>    G	<b>  </b> H	 I	<b>∏</b>	<b>∭</b> K	I <b>∐</b>	M	II N	<b>∭</b> P
										III				
III														
II	III									II			II	III

## FONT INTERPOLATION



## FONT INTERPOLATION

W	W	W	W	W	W	W	W	W	W
J	J	J	J	J	J	$\boldsymbol{J}$	$\boldsymbol{J}$	J	$\boldsymbol{J}$
9	9	9	9	9	9	9	9	9	9
4	4	4	4	4	4	4	4	4	4
9	g	g	g	g	g	g	g	g	g

# Thank You!

#### FURTHER WORK

- Adversarial losses for indirect training
- Conditional Generative Adversarial Networks
- Conditional Variational Autoencoder for latent representation
- Estimating typeface vector graphics from output images