

SAMSUNG SDS

Foresee

Techtonic 2021

Disrupt

Partner



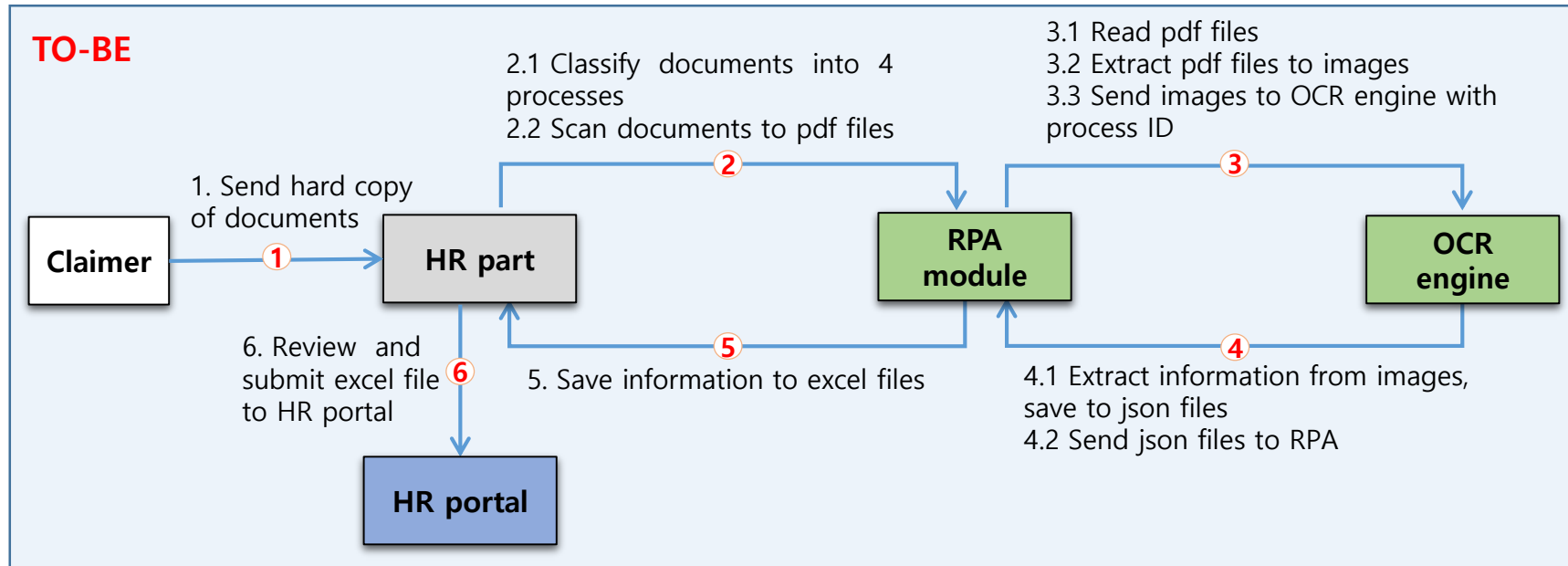
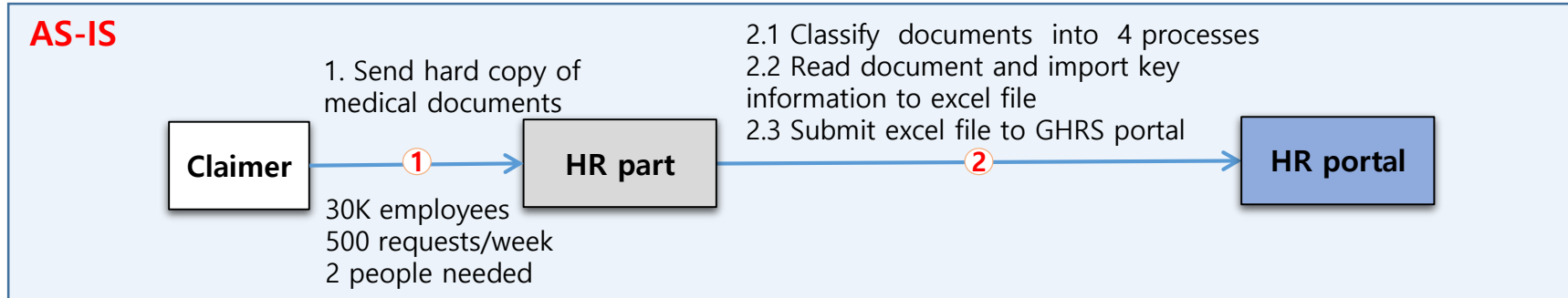
Samsung SDS Research Vietnam

An approach in Vietnamese handwritten OCR



Ngo T Dat

Use case: data input automation



Financial sector: Invoice, application form

Template Cty TNHH Thương Mại Đức Anh

HÓA ĐƠN
GIÁ TRỊ GIA TĂNG

Mẫu số: 01/GTKT3/001
Ký hiệu: DA/13P

Loại: Liên
Ngày: 16 tháng 01 năm 2017
Số: 0000177

Đơn vị bán hàng: CÔNG TY TNHH KỸ THUẬT VÀ THƯƠNG MẠI ĐỨC ANH
Mã số thuế: 0106055129
Địa chỉ: Nóm 11, Xã Thạch Đà, Huyện Mê Linh, TP. Hà Nội, Việt Nam
Điện thoại: 0974 482152
Số tài khoản: 0051145889999 - Tại Ngân hàng TMCP Quân đội - CN Trần Duy Hưng - Hà Nội

Họ tên người mua hàng:
Tên đơn vị: Công ty TNHH Đầu Tư xây dựng Phú Yên
Mã số thuế: 2500222759
Địa chỉ: Khu 11, Thôn Phú Mỹ, Tự Lập, Mê Linh, Hà Nội
Hình thức thanh toán: CK Số tài khoản:

STT	Tên hàng hóa, dịch vụ	Đơn vị tính	Số lượng	Đơn giá	Thành tiền
1	Cáp ethernet ngoài 1 sợi DT 900x2300	Đôi	8	8686,071	69488,568
2	Cáp cat 6 ngoài 2 sợi DT 4200x2300	Đôi	14	10481,455	146740,370
3	Cáp số 6 ngoài 2 sợi DT 4200x2300	Đôi	4	5353,200	21412,800

Cộng tiền hàng: 257.641.738
Thuế suất GTGT: 10% Tiền thuế GTGT: 25.764.174
Tổng cộng tiền thanh toán: 283.405.912

Số tiền viết bằng chữ: Hai trăm sáu mươi một triệu bốn trăm linh năm nghìn Chín trăm mười hai đồng.

Người mua hàng: Người bán hàng: Thủ trưởng đơn vị

Ký hiệu: DA/13P
Tên bên bán hàng: CÔNG TY TNHH KỸ THUẬT VÀ THƯƠNG MẠI ĐỨC ANH
Số hóa đơn: 0000177
Ngày xuất: 16/01/2017
Tên đơn vị: Công ty TNHH Đầu Tư xây dựng Phú Yên
Mã số thuế: 2500222759
Địa chỉ: Khu 11, Thôn Phú Mỹ, Tự Lập, Mê Linh, Hà Nội
Cộng tiền hàng: 261.405.912
Số tiền viết bằng chữ: Hai trăm sáu mươi một triệu bốn trăm linh năm nghìn Chín trăm mười hai đồng.

Invoice code
Seller name
Invoice number
Date
Buyer name
Tax number
Address
Price
Price in word

Limitations of the traditional OCR approach

- Bad image samples

The quick brown fox jumps over the lazy dog

The quick brown fox jumps over the lazy dog

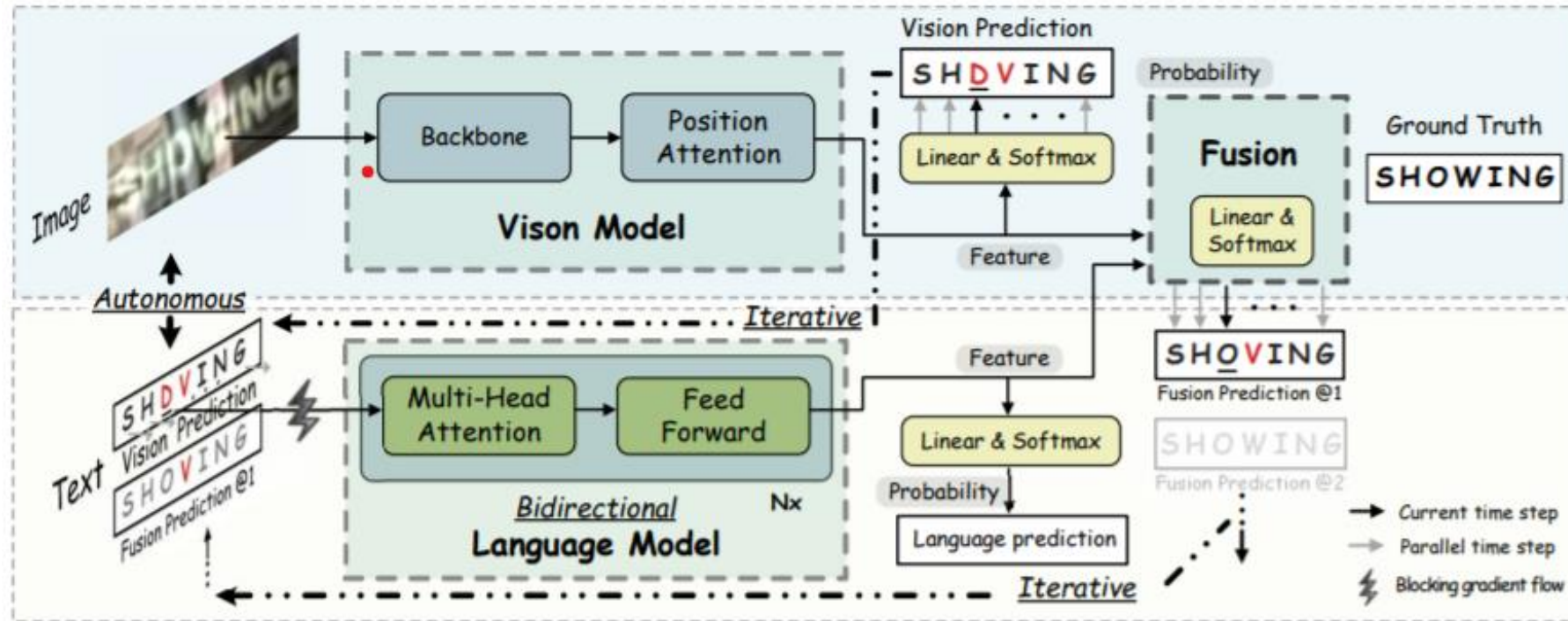
accountably cravenly ⇒ ay chagrining c hino-

- No knowledge about grammar rules or frequently used words.
- Do not understand semantic meaning of words.

⇒ Using Language Model to aid OCR Text Recognition Model can be a good solution.

Overall architecture

The ABINet architecture has demonstrated a feasible way to ensemble Vision Model (VM) and Language Models (LM).

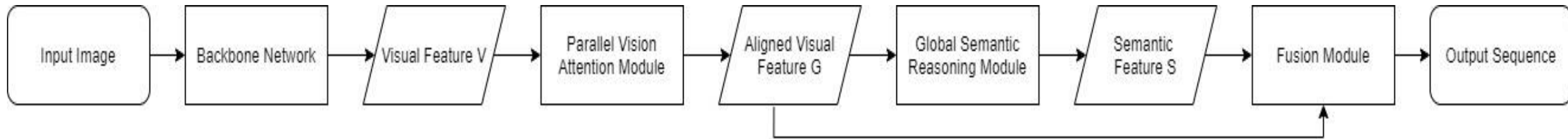


ABINet Architecture

Fang et. al., 2021. "Read Like Humans: Autonomous, Bidirectional and Iterative Language Modeling for Scene Text Recognition". In 2021 IEEE/CVF Conference on Computer Vision and Pattern Recognition (CVPR)

Phase 1 - Vision Model & Language Model

Vision Model - SRNet



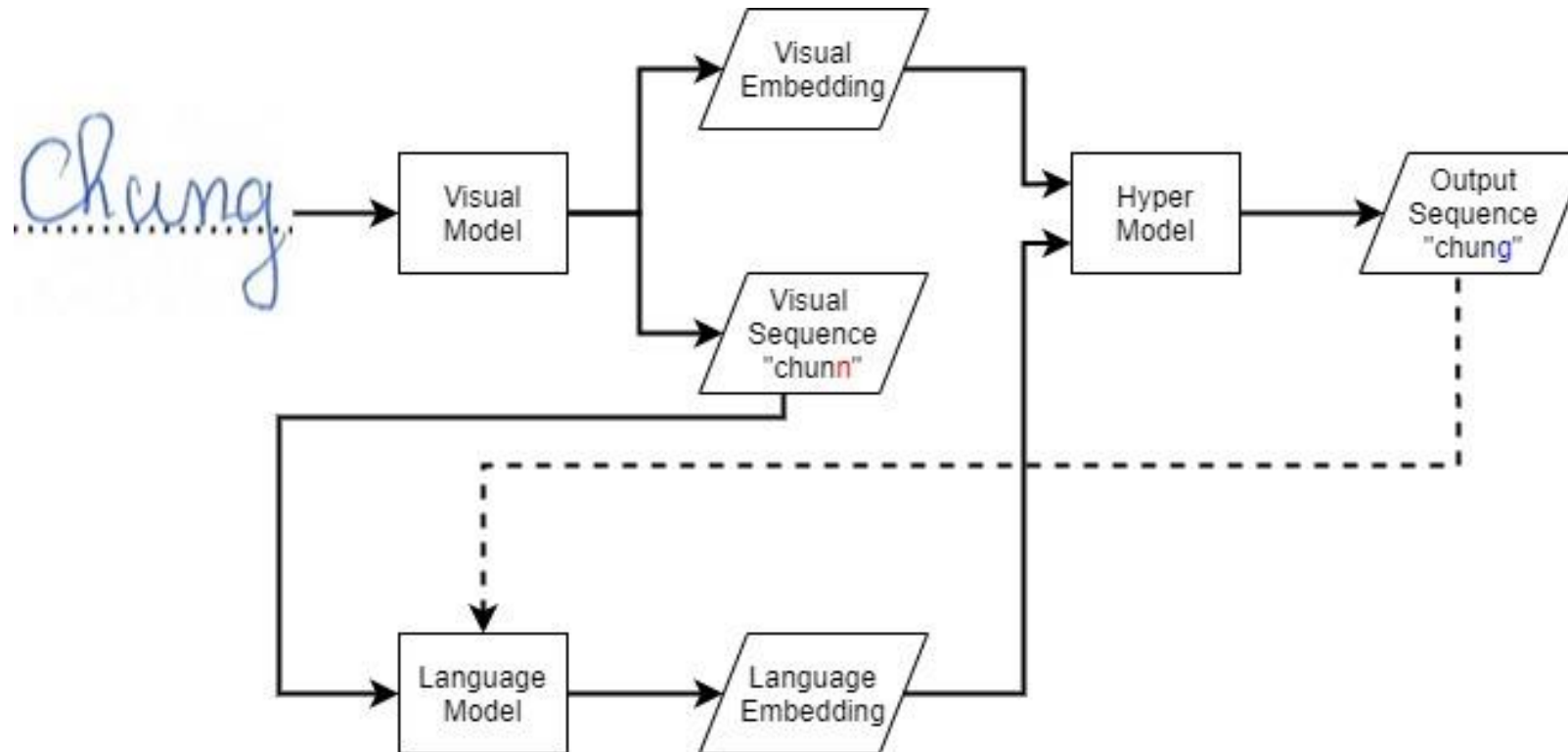
SRNet

Yu et. al., 2020. "Towards Accurate Scene Text Recognition with Semantic Reasoning Networks". In 2020 IEEE/CVF Conference on Computer Vision and Pattern Recognition (CVPR)

Language Model - Transformers

- Introduced in 2017
- A ground breaking achievement in NLP field and now expanding to computer vision.

Phase 2 - Ensemble models



- Training procedure includes two phases.
- In phase 2, two models are jointly trained and a hyper-model (HM) was introduced to stack two phase 1 models' embedding vectors.
- Inference procedure can be single forwarded or iteratively forwarded.

Single word benchmark

- Training data:
 - Two datasets: Vietnamese corpus (50K words, 26M samples), Vietnamese text images (20K images from our employees and 180K generated).
- Testing data:
 - 1300 handwritten words image dataset. One image contains a single cropped word (sized 32x128)
- The HM drastically improved recognition accuracy while not pushing to much computing burden.

Model	Accuracy (percent)	Inference time	
		(ms/word)	(ms/document)
VM (Vision Model)	87.8	2.846	1343
HM (Hyper Model)	95.5	3.076	1452

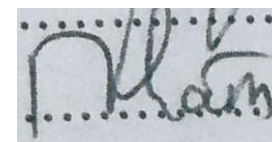
Sample demonstration



VM prediction: "cúy"
HM prediction: "qúy"
Ground truth: "quý"



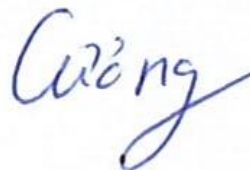
VM prediction: "phạn"
HM prediction: "phạm"
Ground truth: "phạm"



VM prediction: "thâđ"
HM prediction: "chại"
Ground truth: "nhâm"



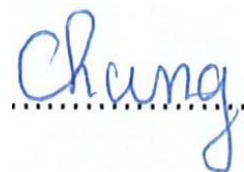
VM prediction: "namc"
HM prediction: "nam"
Ground truth: "nam"



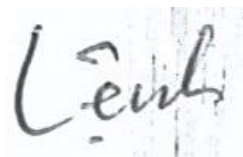
VM prediction: "cuông"
HM prediction: "cương"
Ground truth: "cương"



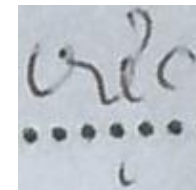
VM prediction: "liitt"
HM prediction: "liệt"
Ground truth: "việt"



VM prediction: "chunn"
HM prediction: "chung"
Ground truth: "chung"



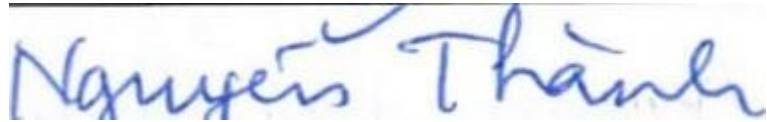
VM prediction: "linh"
HM prediction: "lệh"
Ground truth: "lệnh"



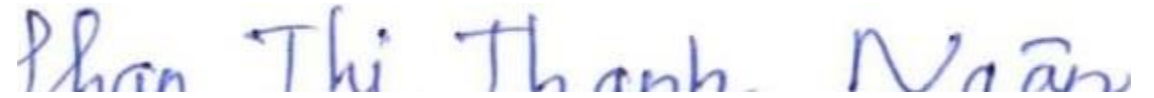
VM prediction: "qiệc"
HM prediction: "đucc"
Ground truth: "vực"

Full name benchmark

- Tested on 400 Vietnamese full names (2 to 4 words):
 - HM: 87% accuracy
 - VM: 77% accuracy



VM Prediction: "Nouyễn Thành"
HM Prediction: "Nguyễn Thành"
Ground truth: "Nguyễn Thành"



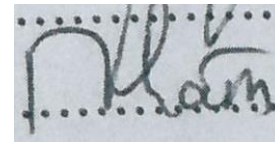
VM Prediction: "Phan Thi Thanh Noân"
HM Prediction: "Phan Thi h Thanh Ngân"
Ground truth: "Phan Thị Thanh Ngân"

Future works

- Improve the LM so it can performs well in cases where visual output has more than two errors.



VM prediction: "liitt"
HM prediction: "liệt"
Ground truth: "việt"



VM prediction: "thâđ"
HM prediction: "chai"
Ground truth: "nhâm"

- Enhance the language model context knowledge even more by switching from character tokenizing mechanism to word tokenizing mechanism,.

Thank you

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