# Automatic Gapping Resolution for Russian AGRR

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### Traditional approach

Gapping - omission of a repeating predicate in a non-initial coordinated clause where two remnants remain expressed.

R	принял	eë	3a	итальянку,	a	его	_	3a	шведа.
Ι	mistook	her	for	Italian	and	him		for	Swede
'I mi	stook her for	Italian	and <del>I</del>	<del>mistook</del> him	for Su	rede'			

### Annotation

- Remnants R1, R2 pronounced elements of the gapped clause, which have correlates
- Remnant correlates cR1, cR2 parallel elements in the full clause similar to the remnants, both semantically and syntactically
- Gap V possible position of missing material
- Gap controller cV main predicate in the full clause



We will return former grip to you tires and return you safety on the road'

# Gapping in AGRR corpus Broader interpretation

# Stripping vs. Gapping with one remnant

### Stripping:

The man stole the car after midnight, **but not** the diamonds. [Merchant 2016]

Abby can speak passable Dutch, and Ben, too.

[Wurmbrand 2013]

Все мы любим Мамбу и Сережа тоже.

All we love Mamba and Serezha too

'All of us love Mamba, and Serezha <del>loves it</del> too'

# Stripping vs. Gapping with one remnant

### Gapping with one remnant:

$[_{cV}$ Добавляем]	[ <sub>cR1</sub> муку,	крахмал	И	разрыхлитель],	a	в конце	[v]	[ <sub>R1</sub> сметану].
add	flour	starch	and	baking.powder	and	at.the.end		sour.cream

'We add flour, starch and baking powder, and at the end we add sour cream.'

```
Рост цен [_{\rm cV} составил] [_{\rm cR1} 11,9%] (за 2009 год [_{\rm V}] [_{\rm R1} 4,4%]). growth prices amounted.to 11.9% in 2009 year 4.4%
```

'The price growth amounted to 11.9 %(in 2009 it amounted to 4.4 %)'

# Gapping in subordinate clauses

$$\begin{bmatrix} c_{cR1} \ OH \end{bmatrix}$$
  $\begin{bmatrix} c_{cV} \ shaet \end{bmatrix}$   $\begin{bmatrix} c_{cR2} \ ee \end{bmatrix}$ , как  $\begin{bmatrix} c_{R1} \ knows \end{bmatrix}$   $\begin{bmatrix} c_{R2} \ coho \end{bmatrix}$   $\begin{bmatrix} c_{R2} \ cho \end{bmatrix}$ 

'He knows her as painter knows his work'

# Different types of remnants

### predicates

Одно может вдохновлять, а другое вгонять в тоску. one can inspire and other put in melancholy 'One thing can inspire and the other—can—put you in a melancholic mood.'

### preposition phrases

Советую вам поменьше думать о проблемах, и побольше — об их решении. recommend you less think about problems and more - about their solution 'I recommend you to think less about problems, and think more about solving them.'

# Different types of remnants

### adverbs

Вначале они играли интересно, потом – прескучно. at.first they played interesting.ADV after - boring.ADV.INT 'At first they played interesting, then they played extremely boring.'

### adjectives

Сердце ее было слишком чистым, чувства слишком искренними. heart her was too pure feelings too sincere 'Her heart was too pure and her feelings were too sincere.'

# Obtaining the data

# Obtaining the data

- Validation of automatically obtained markup instead of annotating sentences from scratch
- Compreno template-based module for gapping detection was used
- Variety of genres: fiction, technical texts, news + social media (vk)
- Every sentence was evaluated by 2 assessors:
  - 0 no gapping
  - 1 markup is ok
  - 2 wrong markup
  - 3 hard to decide

# Assessment analysis

### On technical texts, fiction, news

	0	1	2	3
0	1533	138	129	136
1	240	5301	1021	237
2	213	451	1600	281
3	307	177	117	108

Out of 11989 sentences 44% were considered correctly annotated and 13% were unanimously considered to have no gapping.

# Assessment analysis

### On social media texts

	0	1	2	3
0	1817	232	174	118
1	154	1900	142	46
2	75	130	360	21
3	139	53	36	25

Out of 5422 sentences 35% were considered correctly annotated and 34% were unanimously considered to have no gapping.

# Validation of the corpus

How well does it represent the phenomenon?

# Validation of the corpus

test set from SynTagRus (v. 2015)

- all the sentences were manually verified and divided into three categories:
  - 1 cases similar to the ones encountered in the AGRR corpus
  - 2 cases of gapping not included in the AGRR corpus
  - 3 cases considered other types of ellipsis rather than gapping

# What does the AGRR corpus miss? (cat. 2)

### more than two remnants

the choice of the soul.'

```
[_{cR1} В Испании [_{cR2} в 1923 году [_{cV} установил диктатуру [_{cR3} генерал Педро де Ривера], . In S. . in 1923 year . established dictatorship . general Pedro de Rivera, [_{R1} в Польше [_{R2} в 1926-м] - [_{R3} Пилсудски]. . in Poland . in 1926 - . Pilsudski
```

'In Spain, the dictatorship of General Pedro de Rivera was established in 1923, while in Poland the dictatorship was established by Pilsudski in 1926.'

### • the order of remnants differs from the order of correlates

 $[_{cR1}$  Школа и уроки]  $[_{cV}$  принадлежали]  $[_{cR2}$  кругу мучительных обязанностей], а  $[_{R2}$  . school and lessons . belonged to . circle painful duties and . душевному выбору] -  $[_{R1}$  зеленая птица с красной головой]. soul. ADJ choice - . green bird with red head 'School and lessons belonged to the focus of painful duties, while a green bird with the red head belonged to

# What does the AGRR corpus miss? (cat. 2)

The gap is controlled not by a verb, but by a noun

```
Бюрократизм привел к [_{cV} отчуждению] [_{cR1} трудящихся [_{cR2} от власти], [_{R1} крестьян] red.tape led to alienation working.people from power peasants [_{R2} от земли]. from land
```

'Bureaucracy led to the alienation of working people from power, and alienation of peasants from the land'

### • The correlate is higher syntactically than the elided predicate

Если  $[_{cR1}$  можно]  $[_{cV}$  передать]  $[_{cR2}$  один университет], то почему  $[_{R1}$  нельзя]  $[_{R2}$  if is.possible transfer.INF one university, then why not.possible другие]?! others

'If it is possible to transfer one university, then why can't others be transferred?!'

# What does the AGRR corpus miss? (cat. 2)

Gapping "with generalization"

```
[cR1 Средства и способы] создаются талантливыми учеными, а [cV реализуются]: [R1 means and methods are created talented scientists and are realized средства] - [R2 военной промышленностью], а [R1 способы] - [R2 военной наукой и means - military industry and methods - military science and опытом] experience.
```

'Means and methods are created by talented scientists, and are realized: the means are realized by the military industry, and the methods are realized by military science and experience.'

# What the AGRR corpus does not include? (cat. 3)

### ellipsis in comparative constructions

От сна за рулем погибает столько же водителей, сколько от алкоголя from sleeping behind wheel die as.many drivers how.many/as from alcohol 'As many drivers die from sleeping behind the wheel, as many drivers die from alcohol'

### stripping

B Сталингаде каждый сражается, причем как мужчины, так и женщины in Stalingrad everyone fights and both men and women.'
In Stalingrad, everyone continuously fights, both men and women fight.'

# What the AGRR corpus does not include? (cat. 3)

### sluicing

Медикам дается указание как-то бороться с этим явлением, а как – никому doctors are given instructions somehow cope with this phenomenon and how - no one не известно.

NEG knows

'Doctors are instructed to somehow cope with this phenomenon, but no one knows, how to cope with it.'

additional argument in elided clause

Правила меняются по ходу игры и всегда почему-то одним игроком rules are changed with progress game and always for some reason one player.INST 'The rules are changed as the game progresses and for some reason are changed always by one player'

# Category 2

- More than two remnants
- The order of remnants differs from the order of correlates
- The gap is controlled by a noun
- Gapping "with generalization"

# Category 3

- Ellipsis in comparative constructions
- Stripping
- Sluicing
- Additional argument in elided clause

# Shared Task Set-Up

# Ellipsis resolution task decomposition

- 1. Detect the clause with the gap
- 2. Find the controlling clause (i. e., find the head of the controlling clause)
- 3. Find the remnants and their correlates
- 4. Replace the correlates with corresponding remnants
- Consider agreement, coreference, word order and usage of quantifiers
- 6. Copy resulting structure to the second clause

# Binary presence-absence classification

- Definition: for every sentence, participating systems must decide if there is a gapping construction in it.
- Relevant metrics: precision, recall and **f-measure**
- SOTA on AGRR-2019: 0.96
- Desired behaviour: since gapping is naturally rare precision is much more important than recall

# Gap resolution

- Definition: for every sentence with gapping, participating systems must predict the position of the elided predicate and the pronounced predicate in the antecedent clause.
- Relevant metrics: symbolwise f-measure
- SOTA on AGRR-2019: 0.91

### Full annotation

- Definition: for every sentence with gapping, participating systems must predict the linear position of the elided predicate and positions of its remnants in the clause with the gap, as well as the positions of remnant correlates and pronounced predicate in the antecedent clause.
- Relevant metrics: symbolwise f-measure
- SOTA on AGRR-2019: 0.89

### Full annotation

- Definition: for every sentence with gapping, participating systems must predict the linear position of the elided predicate and positions of its remnants in the clause with the gap, as well as the positions of remnant correlates and pronounced predicate in the antecedent clause.
- Relevant metrics: symbolwise f-measure
- SOTA on AGRR-2019: 0.89

# Symbolwise f-measure example

- Техt: Утопающий, чтобы спасатель мог подтянуть его к судну, должен взяться за петлю руками, а в идеальном варианте — продеть петлю себе подмышки.
- True annotation: cV: 54:60 cR1: 61:84 cR2: V: 111:111 R1: 111:138 R2:
- Test annotation: cV: 54:60 cR1: 60:81 84:85 cR2: 0:9 V: 110:110 R1: R2:
- F-measures: cV: 1.0, cR1: 0.89, cR2: 0.0, V: 0.0, R1: 0.0, R2: 1.0
- Total f massura: 0.482

# SynTagRus results compared to AGRR test

Corpus	Participant	Binary classification	Gap resolution	Full annotation
AGRR2019	Winner	0.96	0.90	0.89
	Second best	0.95	0.86	0.84
SynTagRus	Winner	0.91	0.76	0.77
gapping test set	Second best	0.88	0.67	0.64

# SynTagRus results by class

Category	Total number of samples	Participant	Number of sentences classified as gapping	Fraction of sentences classified as gapping
0	1166	Winner	8	0.007
		Second best	30	0.026
1	507	Winner	433	0.854
		Second best	420	0.828
2	75	Winner	26	0.35
		Second best	37	0.49
3	100	Winner	6	0.06
		Second best	13	0.13

# Track organization

### **Shared task:**

- 1. Closed track an open-source track, convenient for research groups and student teams.
- 2. Open track no restriction on data and systems used

### 3 different gapping tasks:

- 1. Binary presence-absence classification
- 2. Gap resolution
- 3. Full annotation

### Timeline:

- January 26th 2019 data release
- February 2nd noisy data release
- February 23rd submission deadline
- March 5th results

## AGRR Data

R D	ata				nning	
		No ga	pping	Has gapping		sum
dev	vk	670		1382		
uev	other	2090	2760	1056	1302	20548
	vk	2860	10064	1366	5542	
train	other	8004	10864	4176	3342	
test	vk	343	1365	185	680	2045
	other	1022	1202	495	000	
sum			14989		7604	22593

100k+ sentences with noisy data - with automatic gapping annotation

# Questions

### **Closed Track:**

• 9 teams - 5 universities, 2 IT-companies, 2 independent researchers

### **Open Track:**

0 participants

### Closed track:

Should universal pretrained models be allowed?

### **Deadlines:**

Some participants were late!

# Results

esults							
team		binary		resolution	full		
	precision	recall	f-measure	f-measure	f-measure		
fit_predict	0.969	0.95	0.959	0.905	0.892		
EXO	0.899	0.964	0.931	0.815	0.786		
Koziev Ilya	0.774	0.903	0.834	0.677	0.647		
Derise	0.801	0.906	0.850	0.665	0.622		
Meanotek	0.891	0.781	0.832	0.635	0.514		
МГУ-DeepPavlov	0.934	0.644	0.762	0.601	0.587		
vlad	0.778	0.915	0.841	0.574			
MorphoBabushka	0.763	0.619	0.683	0.466	0.440		
nsu-ai	0.485	0.123	0.196	0.037	0.036		

# Late Submissions

			results		
team		binary		gap resolution	full
	precision	recall	f-measure	f-measure	f-measure
МГУ-DeepPavlov	0.973	0.646	0.776	0.617	0.599
МГУ-DeepPavlov	0.898	0.934	0.916		
МГУ-DeepPavlov	0.97	0.712	0.821	0.658	0.653
EXO	0.946	0.946	0.946	0.859	0.836

# Results

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Meanotek	0.891	0.781	0.832	0.635	0.514		
МГУ-DeepPavlov	0.934	0.644	0.762	0.601	0.587		
vlad	0.778	0.915	0.841	0.574			
MorphoBabushka	0.763	0.619	0.683	0.466	0.440		
nsu-ai	0.485	0.123	0.196	0.037	0.036		

github.com/dialogue-evaluation/AGRR-2019