PLOVER: A new framework for political event data

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ANALYTICS

Event Data: Core Innovation

Once calibrated, monitoring and forecasting models based on real-time event data can be run entirely without human intervention

- Web-based news feeds provide a rich multi-source flow of political information in real time
- ▶ Statistical models can be run and tested automatically, and are 100% transparent

In other words, for the first time in human history—quite literally—we have a system that can provide real-time measures of political activity without any human intermediaries

Major phases of event data

- ▶ 1960s-70s: Original development by Charles McClelland (WEIS; DARPA funding) and Edward Azar (COPDAB; CIA funding?). Focus, then as now, is crisis forecasting.
- 1980s: Various human coding efforts, including Richard Beale in National Security Council, unsuccessfully attempt to get near-real-time coverage from major newspapers
- ▶ 1990s: KEDS (Kansas) automated coder; PANDA project (Harvard) extends ontologies to sub-state actions; shift to wire service data
- ▶ early 2000s: TABARI and VRA second-generation automated coders
- ▶ 2007-2011: DARPA ICEWS
- 2012-present: full-parsing coders from near-real-time web-based news sources: PETRARCH and ACCENT

Development of event ontologies

1970s: WEIS, COPDAB, CREON and others

- 1980s: BCOW (Leng) (crisis data: 300 categories)
- 1990s: PANDA (Bond): first ontology to focus on substate actors
- 2000s: IDEA (Bond, VRA): backward compatible with multiple existing ontologies, adds non-political events such as disaster and disease
- 2000s: CAMEO (Gerner and Schrodt): combines ambiguous WEIS categories, expands violence and mediation-related categories; implemented as 15,000-phrase TABARI dictionary
- late 2010s: PLOVER: generalized political coding scheme and data interchange specification

WEIS primary categories (ca. 1965)

01	Yield	11	Reject
02	Comment	12	Accuse
03	Consult	13	Protest
04	Approve	14	Deny
05	Promise	15	Demand
06	Grant	16	Warn
07	Reward	17	Threaten
08	Agree	18	Demonstrate
09	Request	19	Reduce Relationship
10	Propose	20	Expel
	-	21	Seize

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Force

CAMEO

- ▶ 20 primary event categories; around 200 subcategories
- Based on the WEIS typology but with greater detail on violence and mediation
- Combines ambiguous WEIS categories such as [WARN/THREATEN] and [GRANT/PROMISE]
- National actor codes based on ISO-3166 and CountryInfo.txt
- ▶ Substate "agents" such as GOV, MIL, REB, BUS
- ▶ Extensive IGO/NGO list

Open Event Data Alliance

- ▶ Institutionalize event data following the model of CRAN and many other decentralized open collaborative research groups: these turn out to be common in most research communities
- ▶ Provide at least one source of daily updates with 24/7/365 data reliability. Ideally, multiple such data sets rather than "one data set to rule them all"
- ▶ Establish common standards, formats, and best practices
- ▶ Open source, open collaboration, open access

PLOVER

Political Language Ontology for Verifiable Event Records

Event, Actor and Data Interchange Specification

Open Event Data Alliance http://openeventdata.org/ http://ploverdata.org/

DRAFT Version: 0.6b2 March 2017





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PLOVER objectives

- ▶ Only the 2-digit event "cue categories" have been retained from CAMEO. These are defined in greater detail than they were in WEIS and CAMEO.
- ▶ Some additional consolidation of CAMEO codes, and a new category for criminal behavior
- Standard optional fields have been defined for some categories, and the "target" is optional in some categories.
- A set of standardized names ("fields") for JSON (http://www.json.org/) records are specified for both the core event data fields and for extended information such as geolocation and extracted texts;
- We have converted all of the examples in the CAMEO manual to an initial set of English-language "gold standard records" for validation purposes—these files are at https://github.com/openeventdata/PLOVER/blob/master/PLOVER_ GSR_CAMEO.txt—and we expect to both expand this corpus and extend it to at least Spanish and Arabic cases.

Event, Mode, and Context

Most of the detail found in the 3- and 4-digit categories of CAMEO is now found in the *mode* and *context* fields in PLOVER. More generally, PLOVER takes the general purpose "events" of CAMEO (as well as the earlier WEIS, IDEA and COPDAB ontologies) and splits these into "event – mode – context" which generally corresponds to "what – how – why." We anticipate at least four advantages to this:

- 1. The "what -how why" components are now distinct, whereas various CAMEO subcategories inconsistently used the how and why to distinguish between subcategories.
- 2. We are probably increasing the ability of automated classifiers—as distinct from parser/coders—to assign *mode* and *context* compared to their ability to assign subcategories.
- 3. In initial experiments, it appears this approach is *much* easier for humans to code than the hierarchical structure of CAMEO because a human coder can hold most of the relevant categories in working memory (well, that and a few tables easily displayed on a screen)
- 4. Because the words used in differentiate *mode* and *context* are generally very basic, translations of the coding protocols into languages other than English is likely to be easier than translating the subcategory descriptions found in CAMEO.

PLOVER: ASSAULT modes

Name	Content
beat	physically assault
torture	torture
execute	judicially-sanctioned execution
sexual	sexual violence
assassinate	targeted assassinations with any weapon
primitive	primitive weapons: fire, edged weapons, rocks, farm implements
firearms	rifles, pistols, light machine guns
explosives	any explosive not incorporated in a heavy weapon: mines, IEDS, car b
suicide-attack	individual and vehicular suicide attacks
heavy-weapons	crew-served weapons
other	other modes

Adapted from Political Instability Task Force Atrocities Database: http://eventdata.parusanalytics.com/data.dir/atrocities.html

PLOVER: general contexts

Name	Content				
political	political contexts not covered by any of the more specific				
-	categories below				
military	military, including military assistance				
economic	trade, finance and economic development				
diplomatic	diplomacy				
resource	territory and natural resources				
culture	cultural and educational exchange				
disease	disease outbreaks and epidemics				
disaster natural disaster					
refugee	refugees and forced migration				
legal	national and international law, including human rights				
terrorism	terrorism				
government	governmental issues other than elections and legislative				
election	elections and campaigns				
legislative	legislative debate, parliamentary coalition formation				
cbrn	chemical, biological, radiation, and nuclear attacks				
cyber	cyber attacks and crime				
historical	event is historical				
hypothetical	event is hypothetical				

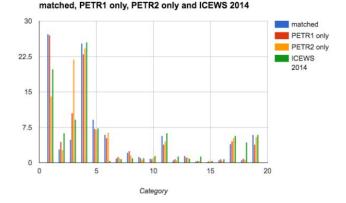
PLOVER output

```
"id": "test-0056-0036 1".
    "date": "2015-02-12",
    "source": [{"actorText": "Russian Foreign Minister Sergei Lavrov", "code": "RUS", "sector": "GOV"},
              {"actorText": "Iranian counterpart Mohammad Javad Zarif", "code": "IRN"}],
    "target": [{"actorText": "Svria crisis", "code": "SYR"}],
    "event": "DISCUSS",
    "eventText": "discussed",
    "mode": "mode-holder",
    "context": "context-holder",
    "text": "MOSCOW: Russian Foreign Minister Sergei Lavrov and his Iranian counterpart Mohammad Javad
    Zarif discussed the Syria crisis by phone Wednesday, the Russian Foreign Ministry said in a statement
    "language": "en",
    "publication": "mudflat test data",
    "coder": "Parus Analytics",
    "version": "0.5b1",
    "dateCoded": "2017-03-20",
    "comment": "test output from mudflat".
},
```

Event data coding programs

- TABARI: C/C++ using internal shallow parsing. http://eventdata.parusanalytics.com/software.dir/tabari.html
- ► JABARI: Java version of TABARI with additional enhancements: alas, abandoned and lost following end of ICEWS research phase
- ► DARPA ICEWS: Raytheon/BBN ACCENT coder can now be licensed for academic research use
- Open Event Data Alliance: PETRARCH 1/2 coders, Moredcai geolocation system. https://github.com/openeventdata
- ▶ NSF RIDIR: developing open-source native-language coders and dictionaries for English, Spanish and Arabic

"CAMEO-World" across coders and news sources



Between-category variance is massively greater than the between-coder variance.

Why the convergence?

- This is simply how news is covered (human-coded WEIS data also looked similar)
- ► The diversity in the language and formatting of stories means no automated coding system can get all of them
- Major differences (PETRARCH-2 on 03; ACCENT on 06, 18) are due to redefinitions or intense dictionary development
- Systems probably have comparable performance on avoiding non-events (95% agreement for PETRARCH 1 and 2)
- ▶ Note these are aggregate *proportions*: ACCENT probably has a higher recall rate, but the otherwise pattern is still the same

So. . .

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philip-schrodt	committed on GitHul	Added doc for CAMEO2PLOVER.txt		Latest commit f6a489a an hou		
	'ER.txt	PLOVER event-mode-context equivalen	ts for CAMEO codes	an hou		
README.md		Added doc for CAMEO2PLOVER.txt				
Coder.py		Simplified/obscured get_NP() and get_c	18 hours			
extract_UD_pa	rse.py	Add primitive version of get_nsubj()		13 days		
globals.py		Add coder module; rename reader and g	11 days			
		Coding for basic compounds and agent	s	11 days		
mudflat.py		Coding for basic compounds and agent		11 days		
 mudflat.py mudflat_testda 	ta_Mk1.txt	Coding for basic compounds and agent	5			

B README.md

mudflat

Minimal universal dependency friendly little automated tagger

A coding system supporting PLOVER (of course): https://github.com/openeventdata/PLOVER; http://ploverdata.org

Universal dependencies

Universal Dependencies v2

Executive summary of changes from v1 to v2

- Tokenization and word segmentation
- Morphology
 - General principles
 - Universal POS tags (single document)
 - Universal features (single document)
 - Language-specific features
 - Conversion from other tagsets
- Syntax
 - General principles
 - Basic dependencies
 - Simple clauses
 - Nominals
 - Complex clauses
 - Other constructions
 - Enhanced dependencies
 - Universal dependency relations (single document)
 - Language-specific relations
- CoNLL-U format

This is the online documentation for Universal Dependencies, version 2 (2016-12-01). Note: The treebanks listed below still follow the v1 guidelines available here.

Upcoming UD-related events

- CoNLL 2017 Shared Task: Multilingual Parsing from Raw Text to Universal Dependencies
- EACL 2017 Tutorial on Universal Dependencies
- NoDaLiDa Workshop on Universal Dependencies (UDW 2017)

Want to know more about UD?

- Short introduction to Universal Dependencies
- How to contribute to UD
- Tools for working with UD

If you want to receive news about Universal Dependencies, you can subscribe to the UD mailing list.

UD Treebanks

	1	Ancient Greek	182K	OÐ	D	00	¥	0/2/07	8
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-		Arabic-NYUAD	629K	QD	-	0	¥	S1031	89
-		Basque	97K	QØ	D	0	×	20.80	21. 2
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Dependency parse: input

```
# sent id = test-0056-0036 1
# source = mudflat test data
# date = 2015 - 02 - 12
# text = MOSCOW: Russian Foreign Minister Sergei Lavrov and his Iranian counterpart
# text = counterpart Mohammad Javad Zarif discussed the Svria crisis by phone
# text = Wednesday, the Russian Foreign Ministry said in a statement.
1
    MOSCOW MOSCOW
                         NNP
                                     root
2
                             punct
з
    Russian Russian
                         NNP
                                     compound
4
   Foreign Foreign
                         NNP
                                     compound
                                 NNP
5
   Minister
                Minister
                                         7
                                             compound
6
    Sergei Sergei
                         NNP
                                     compound
7
    Lavrov Lavrov
                         NNP
                                 15 nsubi
8
    and and
                CC
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                             cc
9
    his he
                PRP$
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                                 nmod:poss
  Iranian iranian
                        33
10
                                 14
                                    amod
11
    counterpart counterpart
                                 NN
                                         14 compound
12
    Mohammad
                Mohammad
                                 NNP
                                         14 compound
    Javad
                                 14 compound
            Javad
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14
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15
    discussed discuss
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16
    the the
                DT
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                             det
17
    Syria
            Syria
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                                    compound
18
    crisis crisis
                         NN
                                 15
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19
    by by
                IN
                         20
                             case
20
    phone
            phone
                         NN
                                     nmod
21
    Wednesday
                Wednesday
                                 NNP
                                         15
                                            nmod:tmod
22
                         15
                             punct
23
    the the
                DT
                         26
                             det
24
    Russian Russian
                         NNP
                                 26
                                     compound
25
    Foreign Foreign
                         NNP
                                 26 compound
26
    Ministry
                Ministry
                                 NNP
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27
    said
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28
    in in
                IN
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29
                DT
                         30
                             det
    а
        а
30
    statement
                statement
                                 NN
                                         27
                                             nmod
31
                             punct
```

Dependency parse: locate subject

sent id = test-0056-0036 1 # source = mudflat test data # date = 2015 - 02 - 12# text = MOSCOW: Russian Foreign Minister Sergei Lavrov and his Iranian counterpart # text = counterpart Mohammad Javad Zarif discussed the Svria crisis by phone # text = Wednesday, the Russian Foreign Ministry said in a statement. MOSCOW MOSCOW NNP root 2 punct Russian Russian NNP compound 4 Foreign Foreign NNP compound NNP 5 Minister Minister 7 compound 6 Sergei Sergei NNP compound 7 Lavrov Lavrov NNP 15 nsubi 8 and and CC 7 cc 9 his he PRP\$ 14 nmod:poss Iranian iranian 77 10 14 amod 11 counterpart counterpart 14 compound 12 Mohammad Mohammad NNP 14 compound 14 Javad Javad NNP compound 14 Zarif Zarif NNP coni 15 discussed discuss VBD 1 dep 16 the the DT 18 det Syria Syria NNP 18 compound 18 crisis crisis NN dobj 19 by by IN 20 case 20 phone phone nmod 21 Wednesday Wednesday NNP 15 nmod:tmod 22 15 punct 23 the the DT 26 det NNP 24 Russian Russian 26 compound 25 Foreign Foreign NNP 26 compound Ministry 26 Ministry NNP 27 nsubi 27 said sav VBD 15 parataxis 28 in in IN 30 case 29 30 det а а 30 statement statement NN 27 nmod 31 punct

Dependency parse: locate verb

sent id = test-0056-0036 1 # source = mudflat test data # date = 2015 - 02 - 12# text = MOSCOW: Russian Foreign Minister Sergei Lavrov and his Iranian counterpart # text = counterpart Mohammad Javad Zarif discussed the Svria crisis by phone # text = Wednesday, the Russian Foreign Ministry said in a statement. MOSCOW MOSCOW NNP root 2 punct Russian Russian NNP compound 4 Foreign Foreign NNP compound NNP 5 Minister Minister 7 compound Sergei Sergei NNP compound 7 Lavrov Lavrov NNP 15 nsubi 8 and and CC 9 his he PRP\$ nmod:poss Iranian iranian 10 14 amod 11 counterpart 14 compound 12 Mohammad. Mohammad NNP 14 compound 13 14 Javad NNP compound Zarif NNF cont 15 discussed discuss VRD dep 16 the the דס 18 det 17 Syria Syria NNP 18 compound 18 crisis crisis dobj NN 19 by by IN 20 20 phone phone nmod 21 Wednesday Wednesday NNP 15 nmod:tmod 22 15 punct 23 the the 26 det NNP 24 Russian Russian 26 compound Foreign Foreign 25 NNP 26 compound Ministry 26 Ministry NNP 27 nsubi 27 said sav VBD 15 parataxis 28 in in IN 30 case 29 30 det а а 30 statement statement 27 nmod 31 punct

Dependency parse: locate direct object

sent id = test-0056-0036 1 # source = mudflat test data # date = 2015 - 02 - 12# text = MOSCOW: Russian Foreign Minister Sergei Lavrov and his Iranian counterpart # text = counterpart Mohammad Javad Zarif discussed the Svria crisis by phone # text = Wednesday, the Russian Foreign Ministry said in a statement. MOSCOW MOSCOW NNP root 2 punct Russian Russian NNP compound Foreign Foreign NNP compound NNP Minister Minister 7 compound Sergei Sergei NNP compound 7 Lavrov Lavrov NNP 15 nsubi 8 and and CC 9 his he PRP\$ nmod:poss Iranian iranian 10 14 amod 11 counterpart 14 compound 12 Mohammad. Mohammad NNP 14 compound 13 Tayad NNF 14 compound 14 Zarif NNF cont 15 discussed discuss VRD dep he the 18 det Syria NNP COMUN Syria 18 crisis crisis 15 dobj 19 by by IN 20 20 phone phone nmod 21 Wednesday Wednesday 15 nmod:tmod 22 15 punct 23 the the 26 det 24 Russian Russian NNP 26 compound 25 Foreign Foreign NNP 26 compound Ministry 26 Ministry NNP 27 nsub 27 said sav VBD parataxis 28 in in IN 30 case 29 30 det а а 30 statement statement 27 nmod 31 punct

Dependency parse: locate actor phrases

sent id = test-0056-0036 1 # source = mudflat test data # date = 2015 - 02 - 12# text = MOSCOW: Russian Foreign Minister Sergei Lavrov and his Iranian counterpart # text = counterpart Mohammad Javad Zarif discussed the Svria crisis by phone # text = Wednesday, the Russian Foreign Ministry said in a statement. MOSCOW MOSCOW NNP root 2 punct Russian Russian NNP compound Foreign Foreign NNP compound Minister Minister NNP 7 compound Sergei Sergei NNP und COMPL Lavrov Lavrov NNP 15 nsub⁺ and and CC 9 his he PRP\$ Iranian iranian 10 amod 11 counterpart 14 compound 12 Mohamma Mohammad NNP 14 compound NNP 13 Javad 14 compound Zarif NNP coni discussed discuss dep he the DT 18 det Syria NNP COMUN Syria 18 crisis crisis 15 dobi 19 by by IN 20 20 phone phone nmod 21 Wednesday Wednesday 15 nmod:tmod 22 15 punct 23 the the 26 det 24 Russian Russian NNP 26 compound 25 Foreign Foreign NNP 26 compound 26 Ministry Ministry NNP 27 nsubi 27 said sav VBD parataxis 28 in in IN 30 case 29 30 det а а 30 statement statement 27 nmod 31 punct

Dependency parse: locate phrases linked by conjunction

sent id = test-0056-0036 1 # source = mudflat test data # date = 2015 - 02 - 12# text = MOSCOW: Russian Foreign Minister Sergei Lavrov and his Iranian counterpart # text = counterpart Mohammad Javad Zarif discussed the Svria crisis by phone # text = Wednesday, the Russian Foreign Ministry said in a statement. MOSCOW MOSCOW NNP root 2 punct Russian Russian NNP compound Foreign Foreign NNP compound Minister Mini NNP compound Sergei Sergei NNP und COMPL 15 Lavrov Lavrov NNP nsub⁺ and and 9 his he PRP\$ Iranian iranian 10 amod 11 counterpart terpar 14 compound 12 Mohamma Moham NNP 14 compound compound 13 Tayad NN Zarif NNP 7 coni discussed discuss ۰. den ho the DT 18 det Syria NNP COMUN 18 crisis crisis 15 dobi 19 by by IN 20 phone phone nmod 21 Wednesday Wednesday 15 nmod:tmod 22 15 punct 23 26 the the 24 Russian Russian compound 25 Foreign Foreign NNP 26 compound 26 Ministry Ministry NNP nsub 27 said sav VBD parataxis 28 in in IN 30 case 29 30 det а 30 statement statement 27 nmod 31 punct

Main event coding: mudflat

```
def get_NP(sdex):
    """ construct noun phrase based on word at sdex """
    index = int(sdex) - 1
    subjstrg = plist[index][1]
    for li in reversed(plist[:index]):
        if li[6] == sdex and li[7] in ["compound", "amod"]:
            subjstrg = li[1] + ' ' + subjstrg
    for li in plist[index + 1:]: # do we ever hit this?
        if li[6] == sdex and li[7] in ["compound", "amod"]:
            subjstrg = subjstrg + ' ' + li[1]
    return subjstrg
def get coni(sdex):
    """ check if there are compound elements: this can be reduced to a, well, reduce """
    actlist = [sdex]
    for li in plist:
        if li[6] == sdex and li[7] == "conj":
            actlist.append(li[0])
    return actlist
def code_events():
# <same initialization code>
    for li in plist:
        if "nsubj" == li[7]:
            srclist = get coni(li[0])
            iroot = int(li[6])
            rootcode = plist[iroot - 1][2].upper() # adjust for zero indexing
            roottext = plist[iroot - 1][1]
            tarlist = []
            for lobi in plist:
                if lobj[7] == "dobj" and lobj[6] == li[6]:
                     tarlist = get coni(lobi[0])
                if tarlist: break
```

Main event coding: mudflat

```
def get_NP(sdex):
    """ construct noun phrase based on word at sdex """
   index = int(sdex) - 1
   return ' '.join(reversed(
            [li[1] for li in reversed(plist[:index]) if li[6] == sdex and li[7] in ["compound", "amod"]]
           )) + ' ' + plist[index][1] + ' ' + \
            ' '.join([li[1] for li in plist[index + 1:] if li[6] == sdex and li[7] in ["compound", "amod"]
def get_conj(sdex):
    """ check if there are compound elements """
    return [sdex] + [li[0] for li in plist if li[6] == sdex and li[7] == "coni"]
def code events():
    """ main coding loop """
    srctext, srccode, srcseccode, srclist = [], [], [], []
    tartext, tarcode, tarseccode, tarlist = [], [], [], []
    roottext, rootcode = "", ""
    for li in plist:
        if "nsubi" == li[7]:
            srclist = get_conj(li[0])
            iroot = int(1i[6])
            rootcode = plist[iroot - 1][2].upper() # adjust for zero indexing
            roottext = plist[iroot - 1][1]
           tarlist = []
            for lobj in plist:
                if lobj[7] == "dobj" and lobj[6] == li[6]:
                     tarlist = get coni(lobi[0])
                if tarlist: break
```

Thank you

Email: schrodt735@gmail.com

Slides: http://eventdata.parusanalytics.com/presentations.html

Links to data and software: https://github.com/openeventdata/PLOVER