

# Lecture 3

A look at language collocations and  
keywords

# Overview

- The focus of this talk – the corpus linguistics perspective collocations and keywords
  - • Some examples
  - • Multi-methods

# Frequency lists

- Simply a list of words and their frequencies in a corpus.

1	the	64420
2	of	31109
3	and	27002
4	to	26062
5	a	21972
6	in	18978
7	is	9961
8	that	9896
9	was	9368
10	it	9298

# Collocation - Definition

*collocations*: the systematic co-occurrence of words in use  
some examples: (you can probably think of your own):

- telephone - operator
- back – front (e.g. *back to front, front and back*)
- tell – story (e.g. *tell me a story*)

# Collocates of diamond

multichip, solitaire, sapphire, jubilee, bingo, bracelet, graphite, brooch, cluster, necklace, waterfall, moth, ruby, presenter, ring, earrings, eternity, pearl, paste, engagement, shaped, tricks, rings, tiger, pin, anne, atoms, celebrated, dogs, rough, gold, dealer, shapes, mining, anniversary, victoria, neil, stone, queen, wedding

# How large should the span be?

- Typically set at +/- 5 words. This seems to be the most useful span for collocates
- Similarly many people set a minimum threshold of frequency for words to count as collocates. I usually use a minimum frequency of 10
- Option to stop at sentence boundaries

# Collocates of **company**

am a widow and he <b>keeps</b> the two of us	<b>company</b>	. Mrs Jackson, Grimston, Norfolk
to follow IBM slavishly) and also <b>keeps</b> the	<b>company</b>	on a smoother footing as it no
laugh, shows me affection constantly, <b>keeps</b> me	<b>company</b>	, gives me something to cuddle and
The bubbling cry of the curlew often <b>keeps</b> you	<b>company</b>	across the moorland to Laddow
the family, aren't you? <b>Keeps</b> me	<b>company</b>	.Say hello to Kevin.I wash it
under present arrangements;Either a	<b>company</b>	<b>keeps</b> going forward or it runs the
of Sir Arthur Sullivan, the D'Oyley Carte Opera	<b>Company</b>	<b>keeps</b> his music alive.Stars from
is covered in sanding marks, but in the	<b>company</b>	it helps us to <b>keep</b> the exception
.The haulier should make sure that his	<b>company</b>	secretary <b>keeps</b> a proper record of
borrowing.Credit Reference Agency: a	<b>company</b>	which <b>keeps</b> files on individuals'
translated: a word may be known by the	<b>company</b>	it <b>keeps</b> .One may look not only at
for Johnstone, the family name behind a	<b>company</b>	which <b>keeps</b> six members of the
been said that a person is judged by the	<b>company</b>	he <b>keeps</b> .It's also true that a
"Of him -- and the	<b>company</b>	he <b>keeps</b> .Go on."

# Rank by frequency

No.	Word	Frequency	Frequency as collocate	In No. of texts
1	<u>the</u>	6,041,234	<u>26151</u>	2155
2	,	5,014,383	<u>10307</u>	1835
3	<u>a</u>	2,164,238	<u>8314</u>	1644
4	<u>of</u>	3,042,376	<u>7039</u>	1551
5	.	4,713,133	<u>5969</u>	1636
6	<u>to</u>	2,593,729	<u>5553</u>	1324
7	<u>'s</u>	783,990	<u>4863</u>	1184
8	<u>and</u>	2,616,708	<u>4726</u>	1433
9	<u>in</u>	1,937,819	<u>4689</u>	1438
10	<u>that</u>	1,118,985	<u>2619</u>	905



# Mutual information

## КОЛИЧЕСТВО ВЗАИМНОЙ информации

No.	Word	Frequency	As collocate	In No. of texts	Mutual information value
1	<u>ec-listed</u>	6	<u>5</u>	1	8.6232085249112
2	<u>anglo-persian</u>	8	<u>6</u>	3	8.4712054314661
3	<u>worshipful</u>	49	<u>34</u>	24	8.3589959278801
4	<u>anglo-iranian</u>	13	<u>9</u>	4	8.3557282140462
5	<u>clothworkers</u>	17	<u>11</u>	6	8.2582117081319
6	<u>'64</u>	13	<u>8</u>	2	8.1858032126039
7	<u>2/2</u>	12	<u>6</u>	1	7.886242930745
8	<u>beller</u>	12	<u>5</u>	3	7.6232085249112
9	<u>petrobras</u>	17	<u>7</u>	7	7.6061350115522
10	<u>d'oyly</u>	35	<u>13</u>	9	7.4573996319411

# Dice coefficient

## коэффициент Дайса

No.	Word	Frequency	As collocate	In No. of texts	Dice coefficient
1	<a href="#">insurance</a>	7,027	<a href="#">446</a>	263	0.019
2	<a href="#">parent</a>	3,728	<a href="#">311</a>	151	0.0143
3	<a href="#">shares</a>	8,386	<a href="#">340</a>	128	0.0141
4	<a href="#">record</a>	14,808	<a href="#">350</a>	94	0.0128
5	<a href="#">limited</a>	10,312	<a href="#">314</a>	135	0.0125
6	<a href="#">says</a>	39,194	<a href="#">482</a>	223	0.0122
7	<a href="#">'s</a>	783,990	<a href="#">4863</a>	1184	0.0118
8	<a href="#">holding</a>	7,963	<a href="#">261</a>	121	0.0109
9	<a href="#">has</a>	256,480	<a href="#">1608</a>	625	0.0109
10	<a href="#">private</a>	17,572	<a href="#">287</a>	165	0.01

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keywords

# Colligation

- A word collocates with a particular grammatical class.
- E.g 'he' colligates with verbs
- 'Mrs' colligates with proper nouns
- determiners colligate with nouns

# Semantic preference

- Similar to Bill Louw's concept of semantic prosody.
- 'the relation, not between individual words, but between a lemma or word-form and a set of semantically related words' Stubbs (2001: 65)

# Semantic preference – glass of

wine, sherry, champagne, beer, poured, water,  
juice, brandy, milk, whisky, orange, lemonade,  
rum, iced, sipped, gin, vodka, small, port,  
cider, lager

# Discourse prosody

- "Discourse prosodies express speaker attitude" (Stubbs 2001: 65)
- CAUSE (Stubbs 2001)
- General Corpus: CAUSE problem(s) 1806, damage 1519, death(s) 1109, disease 591, concern 598, cancer 572, pain 514, trouble 471
- Also: *cause* <accident, anger, chaos, crisis, doubt, hurt, suffering, upset>

# Discourse prosody

- Environmental corpus: *cause <blindness, cancer, concern, damage, depletion, harm, loss, ozone, problem, radiation, warning>*



# (Corpus) Keywords

A keyword list is calculated by comparing 2 frequency lists together – usually a much larger reference corpus against a smaller specialised corpus (but sometimes 2 equal sized corpora).

- Chi-square or log-likelihood test identify the words that are statistically much more frequent in one list when compared to the other.

# <http://ucrel.lancs.ac.uk/llwizard.html>

## Log-likelihood and effect size calculator

To use this wizard, type in frequencies for one word and the corpus sizes and press the calculate button.

	Corpus 1	Corpus 2
Frequency of word	<input type="text"/>	<input type="text"/>
Corpus size	<input type="text"/>	<input type="text"/>

- Notes:
1. Please enter plain numbers without commas (or other non-numeric characters) as they will confuse the calculator!
  2. The LL wizard shows a plus or minus symbol before the log-likelihood value to indicate overuse or underuse respectively in corpus 1 relative to corpus 2.
  3. The log-likelihood value itself is always a positive number. However, my script compares relative frequencies between the two corpora in order to insert an indicator for '+' overuse and '-' underuse of corpus 1 relative to corpus 2.

## How to calculate log likelihood

Log likelihood is calculated by constructing a contingency table as follows:

	Corpus 1	Corpus 2	Total
Frequency of word	a	b	a+b
Frequency of other words	c-a	d-b	c+d-a-b
Total	c	d	c+d

Note that the value 'c' corresponds to the number of words in corpus one, and 'd' corresponds to the number of words in corpus two (N values). The values 'a' and 'b' are called the observed values (O), whereas we need to calculate the expected values (E) according to the following formula:

$$E_i = \frac{N_i \sum_j O_j}{n}$$

# When is a word a keyword?

The analyst needs to apply cut-off points for statistical significance.

- Some analysts only look at the top 10 or 50 or 100 keywords instead.
- Additionally, sometimes a minimum frequency is applied (e.g. a word must occur 20 times before it's a keyword)
- Also, we may specify a keyword has to be reasonably well distributed (occurring in at least 20 texts)

# Common types of keywords

- 1. Proper nouns (Clegg, Ghana etc)
- 2. Markers of style (often grammatical words like must, betwixt)
- 3. Spelling idiosyncrasies (color/colour)
- 4. “Aboutness” words (politics, recipe etc)

# What's the point of it?

- Keywords identify salient words in a corpus, acting as signposts for a linguistic, cultural or discursive analysis. Explaining why they're there and what they do can lead to interesting and unexpected findings.
- Keywords can often not be predicted in advance as humans have cognitive biases when it comes to noticing frequencies.
- The statistical method is replicable and unbiased so it has a high reliability/validity from a scientific viewpoint.

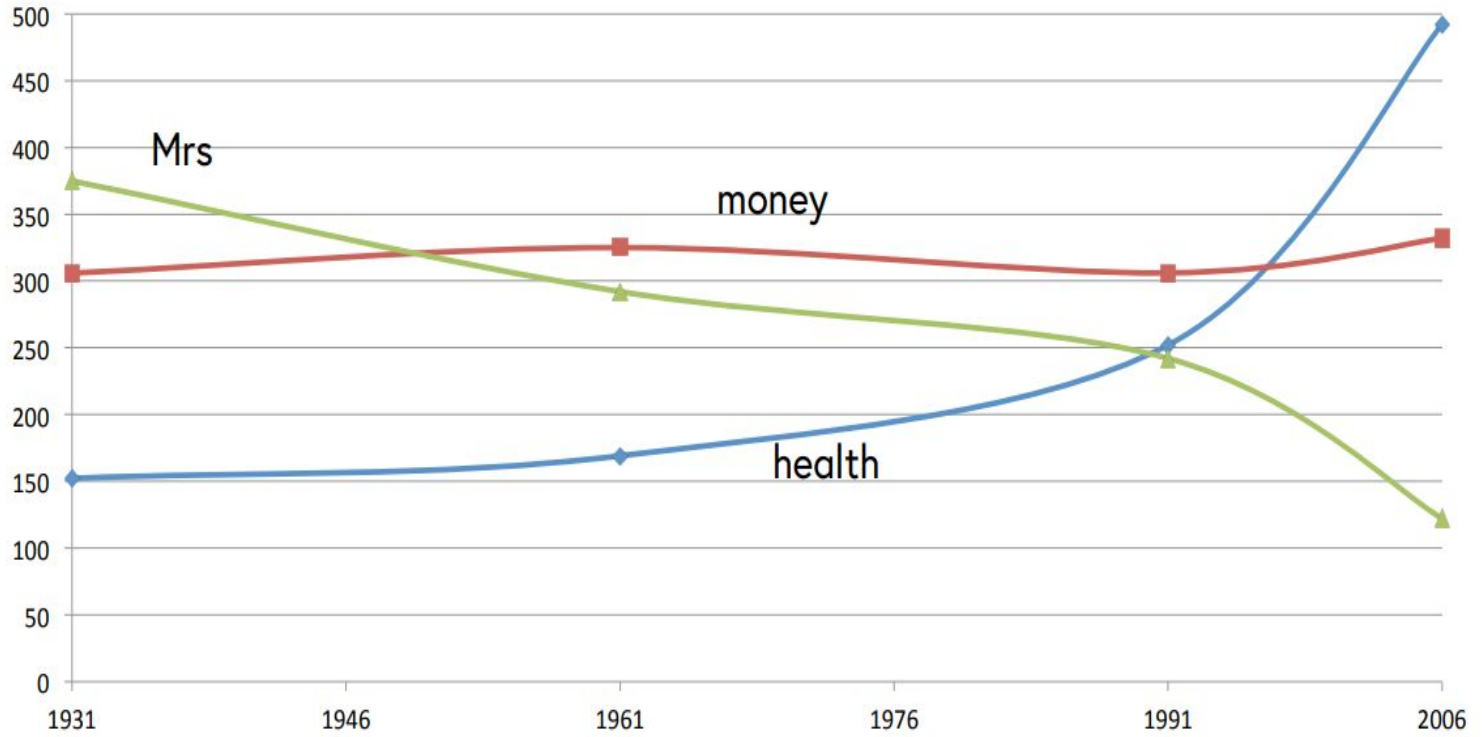
# Example – Change over time (Baker 2011)

- How has British English changed over time? Which words have
  - a) steadily become less frequent
  - b) steadily become more frequent
  - c) stayed pretty much the same (lock words – locked in place)
- What can this tell us about cultural values?

# Identifying key terms

- Four corpora used from 'The Brown Family' each a million words of written, published standard English (news, general prose, academic writing, fiction – 500 samples of 2000 words each), from 1931, 1961, 1991 and 2006.
- A technique called Coefficient of Variance used to identify words with highest and lowest changes in frequency over time.
- Only very frequent words (>1000 occurrences across all corpora considered)

# Examples





# Words that are declining the most

- Terms of address: *Mr, Mrs, sir* (a more informal society?)
- Stronger modal verbs: *shall, must, should* (a more democratic society?)
- Longer forms: *cannot, upon, half* (densification?)

# Lock words

- Weaker modality: *can, could, would*
- Wh- words: *who, what, whether, where*
- Body parts: *hand, face, head, body, eyes*
- Other nouns: *life, world, government, money*

# Words becoming more frequent

- Contracted forms: *it's, didn't, I'm, don't*
- Writing numbers as *34* rather than *thirty four*
- Social terms: *family, children, child, people, social, health, help*
- *Stable keywords vs. Emerging keywords*

being a current smoker are elevated among children with intellectual disabilities ( 95 percent CE for  
y . " People return to your homes ! Kill your children ! Kill your wives ! Then kill yourself ! " No  
fective plans for safeguarding and promoting children 's welfare should be based on a wide-ranging as  
t the formal support for married women with children should be extended to single women and that un  
nd dining table with chairs can not be taken . Children 's toys and other possessions can also not be tak  
owing up I was probably one of thousands of children across the length and breadth of Wales whose da  
them in a boarding school.<sup>95</sup> Many of these children were lucky enough to have relations who visited  
welfare of children and families Supporting children and families 1.1 All children deserve the opport  
ts had a great influence on adults ' as well as children 's behaviour . We all went to confession , said o  
f friends . In the same study , healthy-weight children were rated as clever , attractive , healthy , kind ,  
opean Endeavour ; these were cards made by children visiting the National Maritime Museum Cornwa  
torates published their report , Safeguarding Children , following joint inspections of children 's safeg  
ed of offences listed under Schedule 1 of the Children and Young Persons Act 1933 would obviously c  
ing . But Miss Connor stood up and told the children to leave their things exactly as they were on thei  
es firmly on the road ahead and observed my children pinching each other in the back . If my wife was



# Children

- In the top 10 most increasing words.
- In the 1931 corpus there are more references to "women and children" or "men, women and children".
- In the 2006 corpus there are references to moral panics around children: childhood obesity, paedophiles, poor literacy, poverty, knives, AIDS, adoption, protection from the media (e.g. advertising aimed at children), parental smoking and asthma – children are increasingly viewed as *victims and threats*.
- Does this fit the definition of a keyword as a socially prominent word with interlocking but sometimes contradictory meanings? Or is it too concrete a concept?

# Multi Methods

- Corpora can answer some questions very well, others not at all.
- Corpora can integrate with other methods gainfully
- Corpora can help mesh quantitative and qualitative analyses
- Corpora are a tool – and like any tool they are good for some jobs and not others. They should also be part of a tool set.

# Summing up

- Collocates and keywords are important techniques in corpus linguistics – you will come across the terms many times on this course
- They can tell us ‘about’ texts
- They can tell us about change over time
- They can help us decode argumentation strategies
- And more besides!

The

# IMPOSSIBLE 2

QUIZ



# GraphColl: Collocations in #LancsBox

- Collocation is systematic co-occurrence of words in text and discourse that we identify statistically

node

Love

From Wikipedia, the free encyclopedia

For other uses, see [Love \(disambiguation\)](#).

**Love** is a variety of different feelings, states, and attitudes that ranges from interpersonal affection ("I love my mother") to pleasure ("I loved that meal"). It can refer to an emotion of a strong attraction and personal attachment.<sup>[1]</sup> It can also be a virtue representing human kindness, compassion, and affection—"the unselfish loyal and benevolent concern for the good of another".<sup>[2]</sup> It may also describe compassionate and affectionate actions towards other humans, one's self or animals.<sup>[3]</sup>

Ancient Greeks identified four forms of **love**: kinship or familiarity (in Greek, *storge*), friendship (*philia*), sexual and/or romantic desire (*eros*), and self-

collocation window (span): 2L 2R

variants of these states.<sup>[7]</sup> This diversity of uses and meanings combined with the complexity of the feelings involved makes **love** unusually difficult to consistently define, compared to other emotional states.

**Love** in its various forms acts as a major facilitator of interpersonal relationships and, owing to its central psychological importance, is one of the most common themes in the creative arts.<sup>[8]</sup>

**Love** may be understood as a function to keep human beings together against menaces and to facilitate the continuation of the species.<sup>[9]</sup>

collocates

from	agape
Wikipedia	modern
uses	romantic
see	non-Western
disambiguation	(2) traditions
love (2)	involved
is	makes
a	unusually
affection	difficult
I	in
my	its
mother	emotional
forms	states
of (2)	creative
kinship	arts
or (2)	may
divine	be

# BNC

**Love:** 22,265 hits in 1,983 different texts in 100M words

Collocate	Frequency
of	3,345
i	3,282
and	2,973
in	2,879
to	2,804
the	2,306
you	2,288
with	1,947
for	1,192
a	1,151

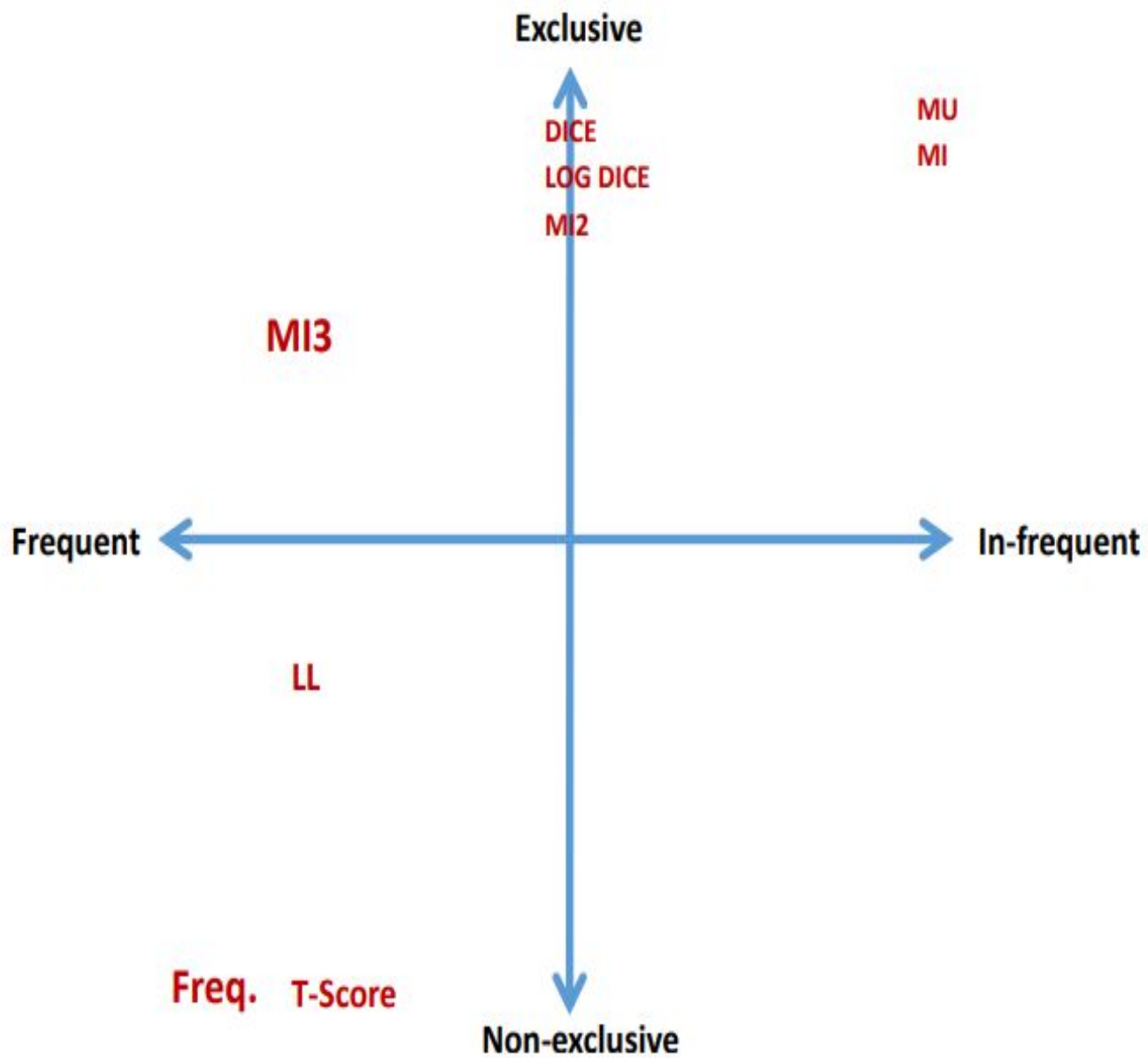
Collocate	MI score
affair	6.3261
fallen	5.8542
falling	5.5687
fell	5.0409
fall	4.9721
god	4.4238
making	3.7614
story	3.5276
'd	3.4879
true	3.3484

association  
measure

# Collocation

- Criteria:
- 1) distance -> span (e.g., L5, R5)
  - 2) frequency
  - 3) exclusivity
- } statistic, e.g. MI, MI3, LL, Log Dice...

ID	Statistic	Equation	ID	Statistic	Equation
1	Freq. of co-occurrence	$O_{11}$	8	T-score	$\frac{O_{11} - E_{11}}{\sqrt{O_{11}}}$
2	MU	$\frac{O_{11}}{E_{11}}$	9	DICE	$\frac{2 \times O_{11}}{R_1 + C_1}$
3	MI (Mutual information)	$\log_2 \frac{O_{11}}{E_{11}}$	10	LOG DICE	$14 + \log_2 \frac{2 \times O_{11}}{R_1 + C_1}$
4	MI2	$\log_2 \frac{O_{11}^2}{E_{11}}$	11	LOG RATIO	$\log_2 \frac{O_{11} \times R_2}{O_{21} \times R_1}$
5	MI3	$\log_2 \frac{O_{11}^3}{E_{11}}$	12	MS (Minimum sensitivity)	$\min\left(\frac{O_{11}}{C_1}, \frac{O_{11}}{R_1}\right)$
6	LL (Log likelihood)	$2 \times \left( O_{11} \times \log \frac{O_{11}}{E_{11}} + O_{21} \times \log \frac{O_{21}}{E_{21}} + O_{12} \times \log \frac{O_{12}}{E_{12}} + O_{22} \times \log \frac{O_{22}}{E_{22}} \right)$	13	DELTA P	$\frac{O_{11}}{R_1} - \frac{O_{21}}{R_2}; \frac{O_{11}}{C_1} - \frac{O_{12}}{C_2}$
7	Z-score	$\frac{O_{11} - E_{11}}{\sqrt{E_{11}}}$	14	Cohen's d	$\frac{Mean_{in\ window} - Mean_{outside\ window}}{pooled\ SD}$



## Collocation (cont.)

Criteria:

1) distance -> span (e.g., L5, R5)

2) frequency

3) exclusivity

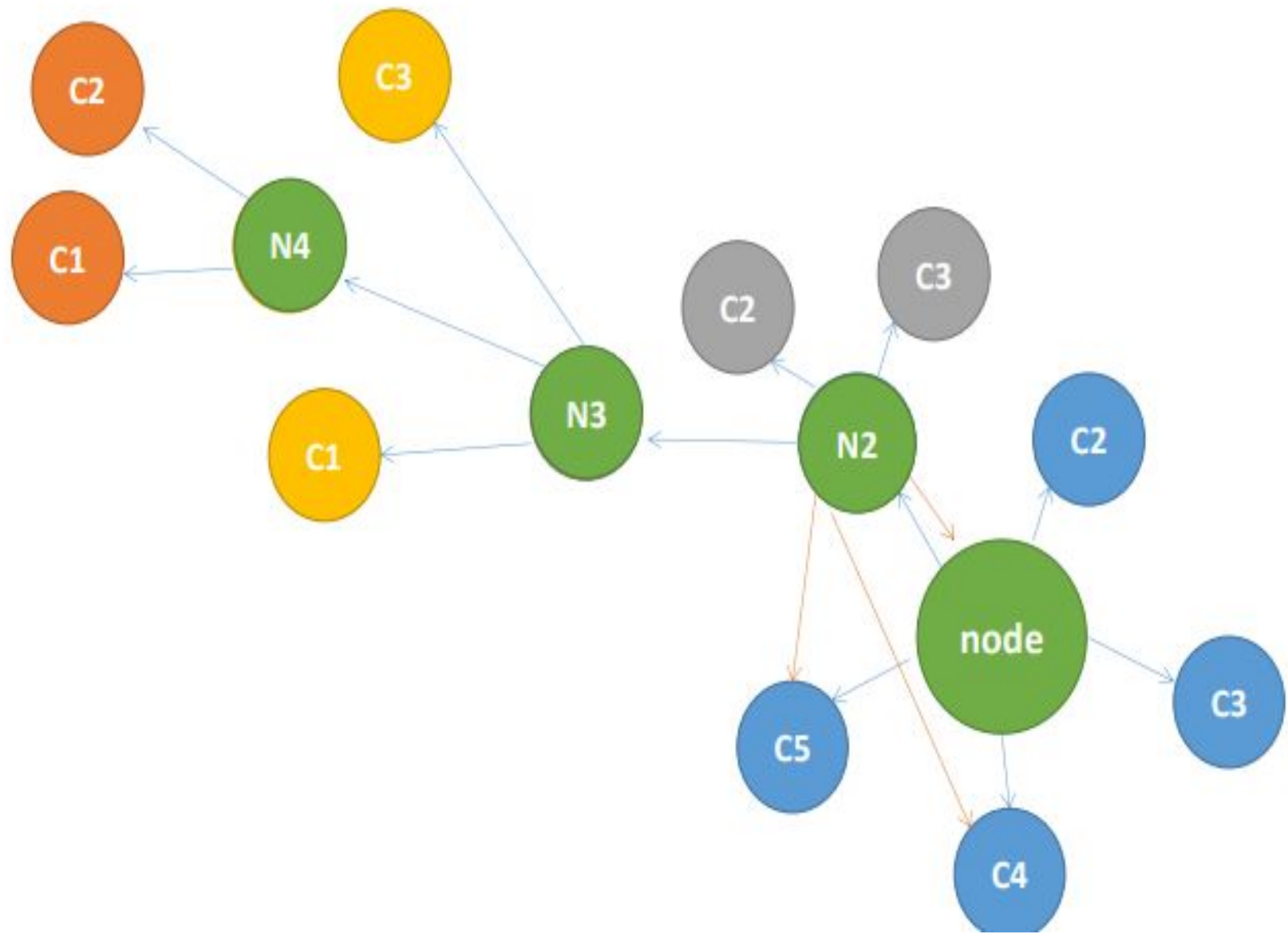
} statistic, e.g. MI, MI3, LL, Log Dice...

4) dispersion

5) directionality: Delta P

6) type-token distribution

**7) connectivity**





## Collocation (cont.)

Brezina, V., McEney, T. & Wattam, S. (2015). Collocations in context: A new perspective on collocation networks. *International Journal of Corpus Linguistics*, 20(2), 139-173.

Gablasova, D., Brezina, V., & McEney, T. (2017b). Collocations in corpus-based language learning research: Identifying, comparing, and interpreting the evidence. *Language Learning*, 67 (S1), 155–179.



# Practical Activities



## Collocations in context with #LancsBox: Collocation graphs and networks

**T** **Task 1.** Create graphs. Work with the LOB corpus.

- a) Build a collocation graph (first-order collocates) around the word *time* using MI score and the default settings.



- b) How many collocates does the graph display? Are all of them useful?
- c) Change the default settings as indicated in the figure below (MI = 5 and above) and search for the node *time* again.



How many results did you get this time?

d) Which of the collocates occur predominantly to the left of the node *time* and which ones to the right?

Left:

.....

Right:

.....

e) Some of the collocates of *time* such as *t*, *kungo* might not be completely transparent. Use the right-click function to obtain concordances (KWIC pop-up) and explain these collocates.

*t* is used as

.....

*kungo* is used as

.....

## Collocations in context with #LancsBox: Collocation graphs and networks

**T** **Task 1.** Create graphs. Work with the LOB corpus.

- a) Build a collocation graph (first-order collocates) around the word *time* using MI score and the default settings.



- b) How many collocates does the graph display? Are all of them useful?  
315 collocates; no, this is an example of an overpopulated graph.

- c) Change the default settings as indicated in the figure below (MI = 5 and above) and search for the node *time* again.



How many results did you get this time? 35



- d) Which of the collocates occur predominantly to the left of the node *time* and which ones to the right?

Left:

e.g. *at, long, first, short, same, spare, waste, twenty* etc.....

Right:

e.g. *ago, speak, saved, arrived, washing, erect, constants, etc.*.....

- e) Some of the collocates of *time* such as *t, kungo* might not be completely transparent. Use the right-click function to obtain concordances (KWIC pop-up) and explain these collocates.

*t* is used as ..... *a mathematical term (time t)*.....

*kungo* is used as ..... *proper name in General fiction*.....