



BAYESIALAB

**Probabilistic Latent Factor Induction
With Bayesian Networks & BayesiaLab**

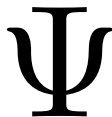
Today's Program

Introduction

- Our Company and Technology

Motivation & Objectives

- Personality Models
- Factor Discovery



Why Bayesian Networks?

- Nomenclature
- Arc Force

BayesiaLab Workflow

- Unsupervised Learning
- Variable Clustering
- Validation
- Multiple Clustering



20 min.



40 min.

Your BayesiaLab Team Today



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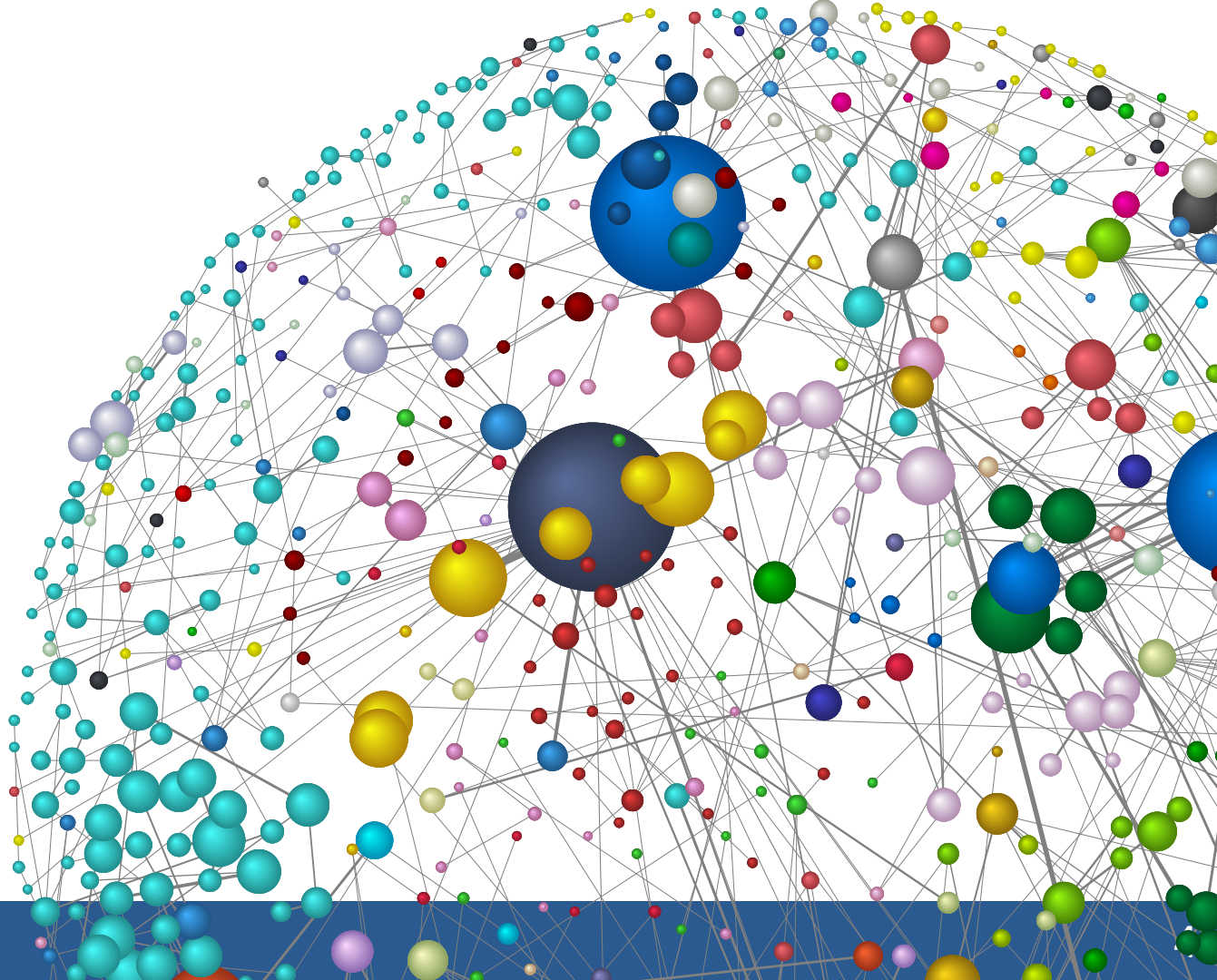
stacey.blodgett@bayesia.us



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Co-founded in 2001
by Dr. Lionel Jouffe &
Dr. Paul Munteanu

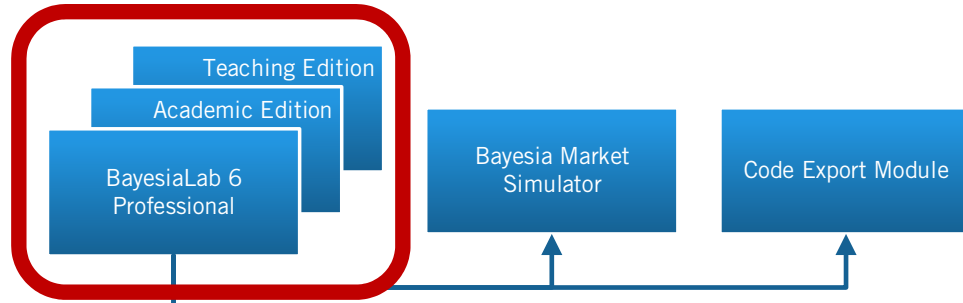


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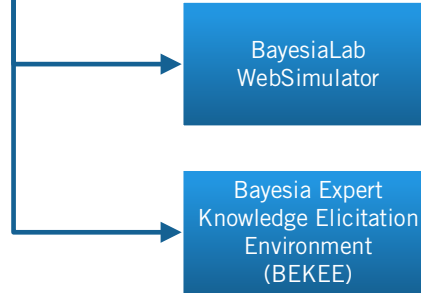
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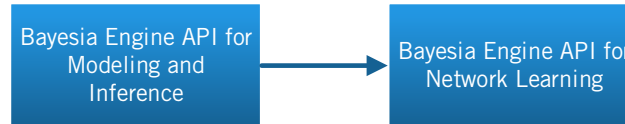
Desktop
Software



Web
Application



API

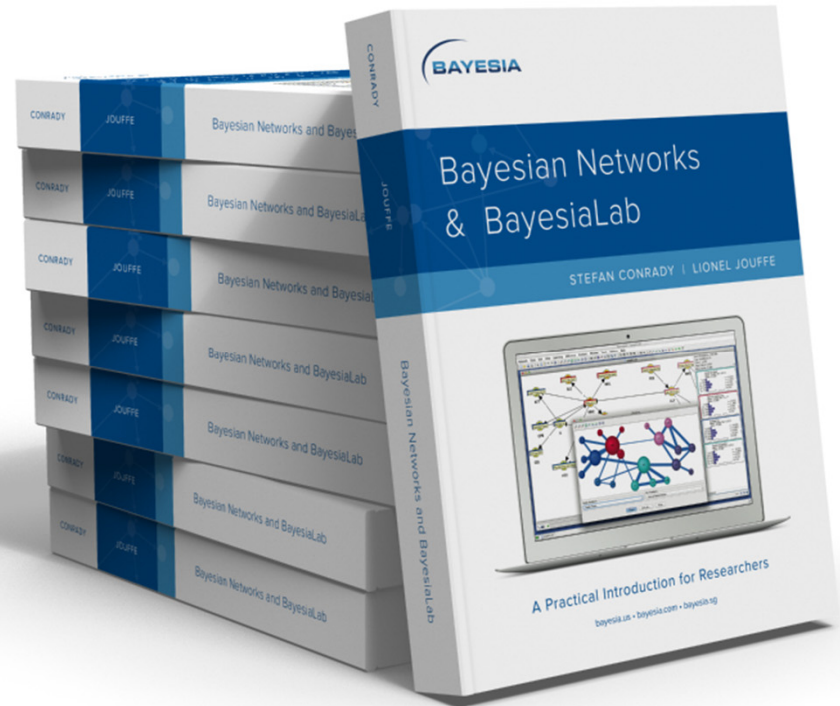




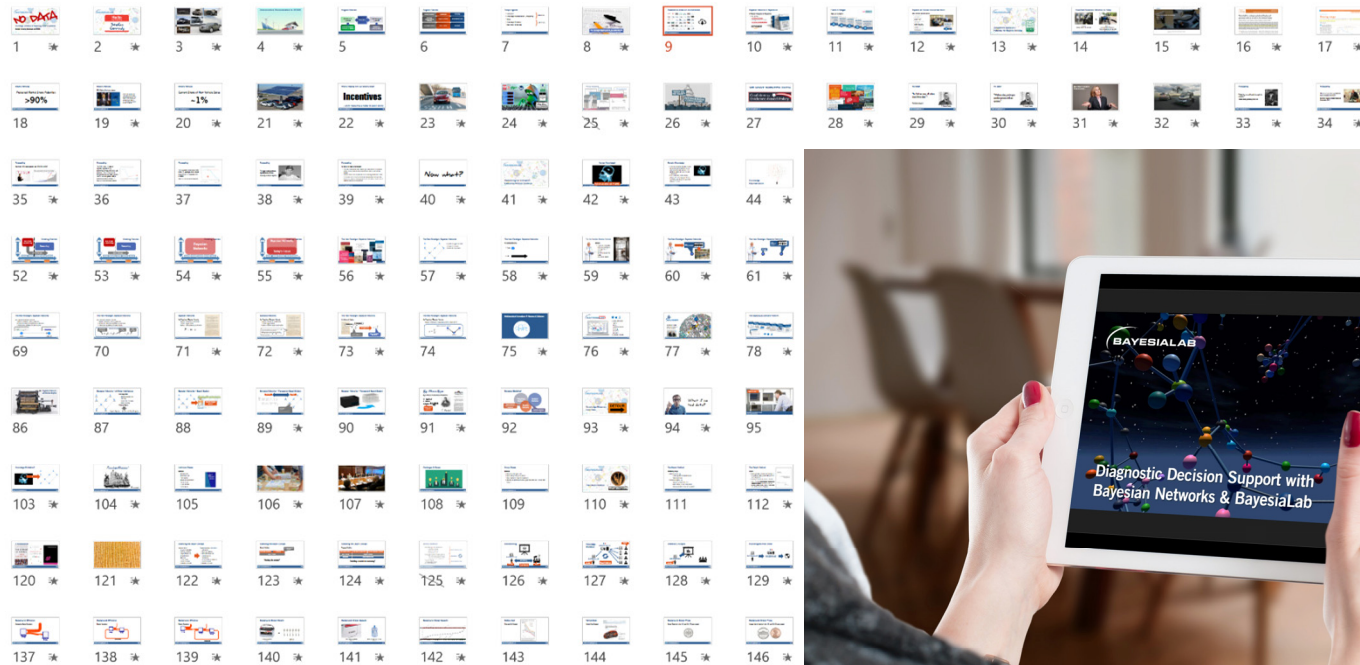
Bayesian Networks & BayesiaLab

A Practical Introduction for Researchers

- Free download:
www.bayesia.com/book
- Hardcopy available on Amazon:
<http://amzn.com/0996533303>
- See Chapter 8



Webinar Slides, Data, and Recording Available





Background & Motivation

The Dimensions of Human Personality

Accessible Active Adaptable Admirable Adventurous Agreeable Alert Allocentric Amiable Anticipative Appreciative Articulate Aspiring Athletic Attractive Balanced Benevolent Brilliant Calm Capable Captivating Caring Challenging Charismatic Charming Cheerful Clean Clear-headed Clever Colorful Companionly Compassionate Conciliatory Confident Conscientious Considerate Constant Contemplative Cooperative Courageous Courteous Creative Cultured Curious Daring Debonair Decent Decisive Dedicated Deep Dignified Directed Disciplined Discreet Dramatic Dutiful Dynamic Earnest Ebullient Educated Efficient Elegant Eloquent Empathetic Energetic Enthusiastic Esthetic Exciting Extraordinary Fair Faithful Farsighted Felicific Firm Flexible Focused Forceful Forgiving Forthright Freethinking Friendly Fun-loving Gallant Generous Gentle Genuine Good-natured Gracious Hardworking Healthy Hearty Helpful Heroic High-minded Honest Honorable Humble Humorous Idealistic Imaginative Impressive Incisive Incorruptible Independent Individualistic Innovative Inoffensive Insightful Insouciant Intelligent Intuitive Invulnerable Kind Knowledge Leaderlike Leisurely Liberal Logical Lovable Loyal Lyrical Magnanimous Manly Many-sided Masculine Mature Methodical Meticulous Moderate Modest Multi-leveled Neat Nonauthoritarian Objective Observant Open Optimistic Orderly Organized Original Painstaking Passionate Patient Patriotic Peaceful Perceptive Perfectionist Personable Persuasive Planful Playful Polished Popular Practical Precise Principled Profound Protean Protective Providential Prudent Punctual Purposeful Rational Realistic Reflective Relaxed Reliable Resourceful Respectful Responsible Responsive Reverential Romantic Rustic Sage Sane Scholarly Scrupulous Secure Selfless Self-critical Self-defacing Self-denying Self-reliant Self-sufficient Sensitive Sentimental Seraphic Serious Sexy Sharing Shrewd Simple Skillful Sober Sociable Solid Sophisticated Spontaneous Sporting Stable Steadfast Steady Stoic Strong Studious Suave Subtle Sweet Sympathetic Systematic Tasteful Teacherly Thorough Tidy Tolerant Tractable Trusting Uncomplaining Understanding Undogmatic Unfoolable Upright Urbane Venturesome Vivacious Warm Well-bred Well-read Well-rounded Winning Wise Witty Youthful Absentminded Aggressive Ambitious Amusing Artful Ascetic Authoritarian Big-thinking Boyish Breezy Businesslike Busy Casual Cerebral Chummy Circumspect Competitive Complex Confidential Conservative Contradictory Crisp Cute Deceptive Determined Dominating Dreamy Driving Droll Dry Earthy Effeminate Emotional Enigmatic Experimental Familial Folksy Formal Freewheeling Frugal Glamorous Guileless High-spirited Hurried Hypnotic Iconoclastic Idiosyncratic Impassive Impersonal Impressionable Intense Invisible Irreligious Irreverent Maternal Mellow Modern Moralistic Mystical Neutral Noncommittal Noncompetitive Obedient Old-fashioned Ordinary Outspoken Paternalistic Physical Placid Political Predictable Preoccupied Private Progressive Proud Pure Questioning Quiet Religious Reserved Restrained Retiring Sarcastic Self-conscious Sensual Skeptical Smooth Soft Solemn Solitary Stern Stoic Strict Stubborn Stylish Subjective Surprising Soft Tough Unaggressive Unambitious Unceremonious Unchanging Undemanding Unfathomable Unhurried Uninhibited Unpatriotic Unpredictable Unreligious Unsentimental Whimsical Abrasive Abrupt Agonizing Aimless Airy Aloof Amoral Angry Anxious Apathetic Arbitrary Argumentative Arrogant Artificial Asocial Assertive Astigmatic Barbaric Bewildered Bizarre Bland Blunt Boisterous Brittle Brutal Calculating Callous Cantankerous Careless Cautious Charmless Childish Clumsy Coarse Cold Colorless Complacent Complimentary Compulsive Conceited Condemnatory Conformist Confused Contemptible Conventional Cowardly Crafty Crass Crazy Criminal Critical Crude Cruel Cynical Decadent Deceitful Delicate Demanding Dependent Desperate Destructive Devious Difficult Dirty Disconcerting Discontented Discouraging Discourteous Dishonest Disloyal Disobedient Disorderly Disorganized Disputatious Disrespectful Disruptive Dissolute Dissonant Distractible Disturbing Dogmatic Domineering Dull Easily Discouraged Ego-centric Enervated Envious Erratic Escapist Excitable Expedient Extravagant Extreme Faithless Fanatical Fanciful Fatalistic Fawning Fearful Fickle Fiery Fixed Flamboyant Foolish Forgetful Fraudulent Frightening Frivolous Gloomy Graceless Grand Greedy Grim Gullible Hateful Haughty Hedonistic Hesitant Hidebound High-handed Hostile Ignorant Imitative Impatient Impractical Imprudent Impulsive Inconsiderate Incurious Indecisive Indulgent Inert Inhibited Insecure Insensitive Insincere Insulting Intolerant Irascible Irrational Irresponsible Irritable Lazy Libidinous Loquacious Malicious Mannered Mannerless Mawkish Mealy-mouthed Mechanical Meddlesome Melancholic Meretricious Messy Miserable Miserly Misguided Mistaken Money-minded Monstrous Moody Morbid Muddle-headed Naive Narcissistic Narrow Narrow-minded Natty Negativistic Neglectful Neurotic Nihilistic Obnoxious Obsessive Obvious Odd Offhand One-dimensional One-sided Opinionated Opportunistic Oppressed Outrageous Overimaginative Paranoid Passive Pedantic Perverse Petty Pharisaeal Phlegmatic Plodding Pompous Possessive Power-hungry Predatory Prejudiced Presumptuous Pretentious Prim Procrastinating Profligate Provocative Pugnacious Puritanical Quirky Reactionary Reactive Regimental Regretful Repentant Repressed Resentful Ridiculous Rigid Ritualistic Rowdy Ruined Sadistic Sanctimonious Scheming Scornful Secretive Sedentary Selfish Self-indulgent Shallow Shortsighted Shy Silly Single-minded Sloppy Slow Sly Small-thinking Softheaded Sordid Steely Stiff Strong-willed Stupid Submissive Superficial Superstitious Suspicious Tactless Tasteless Tense Thievish Thoughtless Timid Transparent Treacherous Trendy Troublesome Unappreciative Uncaring Uncharitable Unconvincing Uncooperative Uncreative Uncritical Unctuous Undisciplined Unfriendly Ungrateful Unhealthy Unimaginative Unimpressive Unlovable Unpolished Unprincipled Unrealistic Unreflective Unreliable Unrestrained Unself-critical Unstable Vacuous Vague Venal Venomous Vindictive Vulnerable Weak Weak-willed Well-

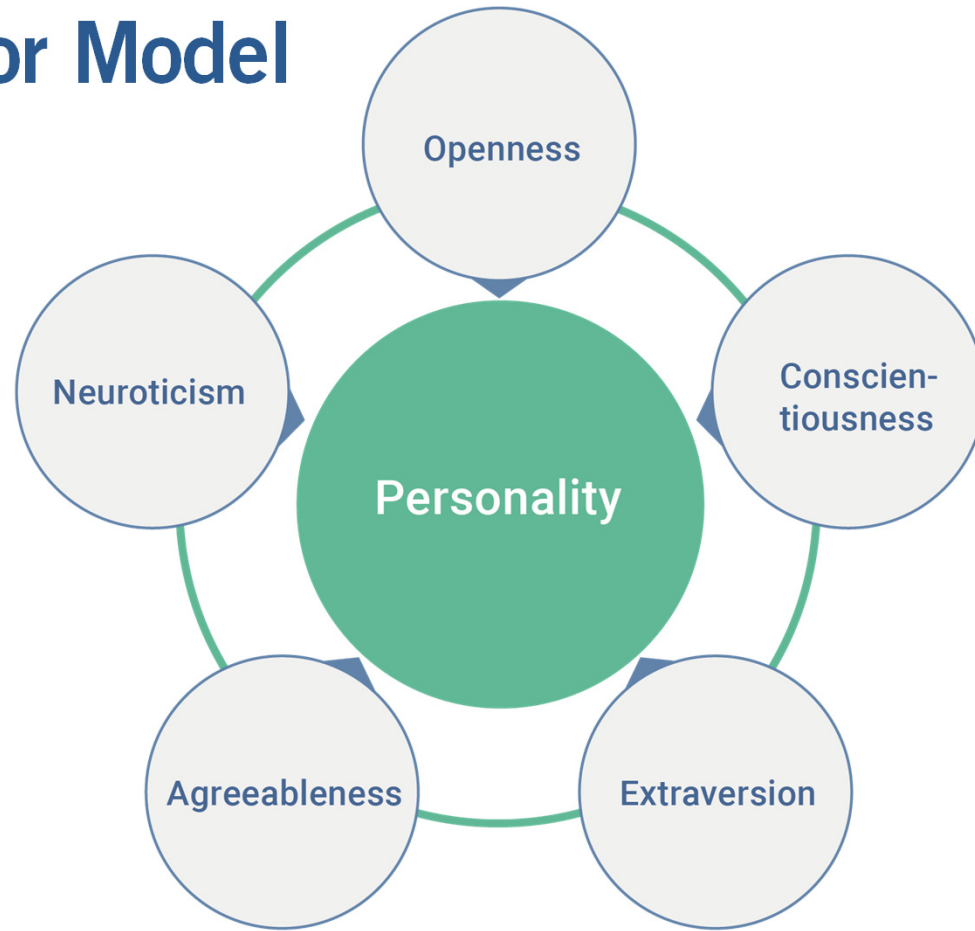
How Many Dimensions?



Eysenck's PEN Model of Personality

PSYCHOTICISM	EXTRAVERSION	Neuroticism
Aggressive	Sociable	Anxious
Assertive	Irresponsible	Depressed
Egocentric	Dominant	Guilt Feelings
Unsympathetic	Lack of reflection	Low self-esteem
Manipulative	Sensation-seeking	Tense
Achievement-oriented	Impulsive	Moody
Dogmatic	Risk-taking	Hypochondriac
Masculine	Expressive	Lack of autonomy
Tough-minded	Active	Obsessive

Five Factor Model



Multivariate Behavioral Research, 39 (2), 329-358
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Psychometric Properties of the HEXACO Personality Inventory

Kibeom Lee
University of Calgary

Michael C. Ashton
Brock University

We introduce a personality inventory designed to measure six major dimensions of personality derived from lexical studies of personality structure. The HEXACO Personality Inventory (HEXACO-PI) consists of 24 facet-level personality trait scales that define the six personality factors named Honesty-Humility (H), Emotionality (E), Extraversion (X), Agreeableness (A), Conscientiousness (C), and Openness to Experience (O). In this validation study involving a sample of over 400 respondents, all HEXACO-PI scales showed high internal consistency reliabilities, conformed to the hypothesized six-factor structure, and showed adequate convergent validities with external variables. The HEXACO factor space, and the rotations of factors within that space, are discussed with reference to J. S. Wiggins' work on the circumplex.

HEXACO Personality Inventory

- The HEXACO model of personality conceptualizes human personality in terms of six dimensions.
 - Honesty-Humility (H)
 - Emotionality (E)
 - Extraversion (X)
 - Agreeableness (versus Anger) (A)
 - Conscientiousness (C)
 - Openness to Experience (O)
- It was proposed as alternative to the Big Five/FFM (Five Factor Model)

HEXACO Personality Inventory: 240 Questions

I love dangerous situations.
I need the approval of others.
I am the life of the party.
I am quick to judge others.
I make careless mistakes.
I seldom experience sudden intuitive insights.
I feel others' emotions.
I come up with something new.
I would not enjoy being a famous celebrity.
I tire out quickly.
I face danger confidently.
I react strongly to criticism.
I keep others at a distance.
I seem to derive less enjoyment from interacting with people than others do.
I prefer to eat at expensive restaurants.
I pretend to be concerned for others.
I often worry about things that turn out to be unimportant.
I would never go riding down a stretch of rapids in a canoe.
I rarely get irritated.
I demand quality.
I prefer to just let things happen.
I would not regret my behavior if I were to take advantage of someone impulsively.
I will not probe deeply into a subject.
I am sensitive to the needs of others.
I say little.
I don't know much about history.
I suspect that my facial expressions give me away when I feel sad.
I am good at making impromptu speeches.
I pay too little attention to details.
I do things without thinking of the consequences.
I maintain high energy throughout the day.
I have an eye for detail.
I have excellent ideas.
I am usually a patient person.

I steal things.
I need reassurance.
I boast about my virtues.
I do not like art.
I don't think that I'm better than other people.
I feel comfortable around people.
I seldom get mad.
I get upset easily.
I talk to a lot of different people at parties.
I when interacting with a group of people, am often bothered by at least one of them.
I try to forgive and forget.
I make a fool of myself.
I know that my ideas sometimes surprise people.
I get bored easily.
I rarely have a hobby.
I enjoy making plans.
I want to be successful.
I love to be the center of attention.
I rarely feel angry with people.
I have a strong personality.
I have a good word for everyone.
I tell people about it when I'm irritated.
I have great stamina.
I love luxury.
I would feel very badly for a long time if I were to steal from someone.
I don't finish the things that I start.
I find it difficult to approach others.
I usually like to spend my free time with people.
I admire a really clever scam.
I distrust people.
I can't do without the company of others.
I seldom get emotional.
I enjoy intellectual games.
I am mainly interested in money.

I find it hard to forgive others.
I don't know why I do some of the things I do.
I like to attract attention.
I have a vivid imagination.
I see myself as an average person.
I rarely cry during sad movies.
I work hard.
I don't worry about things that have already happened.
I wish to stay young forever.
I am hard to reason with.
I love to think up new ways of doing things.
I speak softly.
I do not have a good imagination.
I feel healthy and vibrant most of the

I adjust easily.
I am willing to take risks.
I believe in the importance of art.
I rarely feel depressed.
I don't strive for elegance in my appearance.
I swim against the current.
I rebel against authority.
I get angry easily.
I get upset by unpleasant thoughts that come into my mind.
I return extra change when a cashier makes a mistake.
I get deeply immersed in music.
I speak softly.
I do not enjoy watching dance performances.

I might not notice.
I would hate to be considered odd or strange.
I criticize others' shortcomings.
I am good at taking advice.
I am usually active and full of energy.
I would not enjoy a job that involves a lot of social interaction.
I often forget to put things back in their proper place.
I find it necessary to please the people who have power.
I have little to say.
I feel that I have a lot of inner strength.
I hang around doing nothing.
I am a physical coward.

I rarely enjoy being with people.
I play a role in order to impress people.
I try to follow the rules.
I don't mind being the center of attention.
I get started quickly on doing a job.
I consider myself an average person.
I get upset if others change the way that I have arranged things.
I am inclined to forgive others.
I speak ill of others.
I am likely to show off if I get the chance.
I enjoy being thought of as a normal mainstream person.
I am not easily disturbed by events.

I put on a show to impress people.
I am just an ordinary person.
I become frustrated and angry with people when they don't live up to my expectations.
I get chores done right away.
I jump into things without thinking.
I have a lot of fun.
I get even with others.
I am more capable than most others.
I worry about things.
I can't stand being contradicted.
I am seldom bothered by the apparent suffering of strangers.
I cry during movies.
I have leadership abilities.
I leave a mess in my room.
I am annoyed by others' mistakes.
I immediately feel sad when hearing of an unhappy event.
I quickly lose interest in the tasks I start.
I complete tasks successfully.
I am interested in science.
I like order.
I do things according to a plan.
I show my sadness.
I tell other people what they want to hear so that they will do what I want them to do.
I lose my temper.
I act impulsively when something is bothering me.
I don't bother worrying about political and social problems.
I am easily annoyed.
I do not like concerts.
I don't pretend to be more than I am.
I am full of ideas.

240 Questions → 6 Dimensions

feel angry at someone.
I let people push me around to help them feel important.
I would love to explore strange places.
I have read the great literary classics.
I want to be liked.
I don't talk a lot.
I seldom feel weepy while reading the sad part of a story.
I stop when work becomes too difficult.
I smile a lot.
I would be afraid to give a speech in public.
I seek status.
I am deeply moved by others' misfortunes.
I am hard to convince.
I push myself very hard to succeed.
I switch my loyalties when I feel like it.

other people.
I like to tidy up.
I try to impress others.
I continue until everything is perfect.
I would fear walking in a high-crime part of a city.
I let myself be influenced by others.
I would be good at rescuing people from a burning building.
I keep in the background.
I hate being the center of attention.
I get irritated easily.
I have an intense, boisterous laugh.
I take things as they come.
I am hard to get to know.
I have a sharp tongue.
I leave my belongings around.
I seek support.
I laugh a lot.
I see beauty in things that others

I like to be viewed as proper and conventional.
I need protection.
I find fault with everything.
I make rash decisions.
I often need help.
I use flattery to get ahead.
I find political discussions interesting.
I accept people as they are.
I believe that I am better than others.
I am exacting in my work.
I dislike imperfect work.
I avoid mistakes.
I try to avoid complex people.
I love to read challenging material.
I tremble in dangerous situations.
I like to do frightening things.
I talk a lot.
I don't like to draw attention to myself.
I do too little work.

I panic easily.
I act like different people in different situations.
I do just enough work to get by.
I want everything to add up perfectly.
I make plans and stick to them.
I am nice to people I should be angry at.
I hold a grudge.
I would never take things that aren't mine.
I seldom notice the emotional aspects of paintings and pictures.
I cheat on people who have trusted me.
I like to be thought of as a normal kind of person.
I avoid difficult reading material.
I begin to panic when there is danger.
I would never cheat on my taxes.

I am interested in science.
I like order.
I do things according to a plan.
I show my sadness.
I tell other people what they want to hear so that they will do what I want them to do.
I lose my temper.
I act impulsively when something is bothering me.
I don't bother worrying about political and social problems.
I am easily annoyed.
I do not like concerts.
I don't pretend to be more than I am.
I am full of ideas.

HEXACO Personality Inventory: 240 Questions

All variables are recorded on a seven-point scale

- 1 = strongly disagree
- 2 = disagree
- 3 = slightly disagree
- 4 = neutral
- 5 = slightly agree
- 6 = agree
- 7 = strongly agree



This website provides a collection of interactive personality tests with detailed results that can be taken for personal entertainment or to learn more about personality assessment. These tests range from very serious and widely used scientific instruments popular psychology to self produced quizzes. A special focus is given to the strengths, weaknesses and validity of the various systems.

Recommended test for scientific validity

[Big Five Personality Test](#): The general consensus in academic psychology is that there are five fundamental personality traits. This model is assumed in most personality research, and is the basis of many of the most well regarded tests employed by psychologists who maintain close connections with academia. The "big five" tend to not be popular in consumer focused personality assessment or self-help because to many people the feedback of the model seems relatively basic. This test uses public domain scales from the International Personality Item Pool.

Recommended test for personal enjoyment

[Open Extended Jungian Type Scales](#): The system of personality types proposed by Carl Jung (1921) and later refined by C. Myers and I. M. Briggs has become an extremely widely used personality theory in self-help, business management, counselling and spiritual development contexts, but it is not commonly used in academic research where, like all type theories, it is treated sceptically. The system produces 16 personality types on the basis of four dichotomies and is the system used in the Myers Briggs Type Indicator and Keirsey Temperament Sorter instruments, among many others. The OEJS is a free and open source measure of the four dichotomies which yields an equivalent result to the usual tests.

Today's Objectives

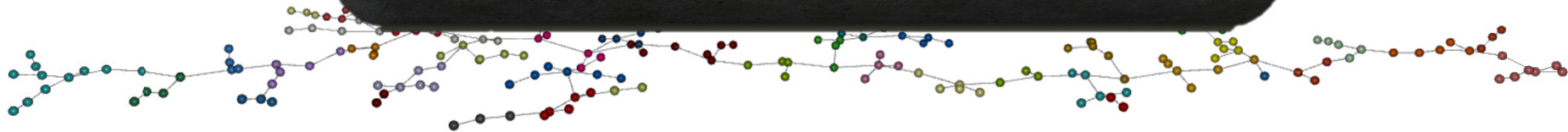
“Exploratory Factor Discovery”

- Discovery of **latent** (hidden) concepts.
- Easy-to-interpret, meaningful factors
- Homogenous clusters
- Stable dimensions
- “Careful” dimension reduction
- Computationally tractable

lateo (present infinitive latere, perfect active latui); second conjugation, no passive

- I am concealed or in hiding, lurk, skulk.
 - Latet anguis in herba. – A snake hides in the grass.
 - Sub nomine pacis bellum latet. – War lurks under the name of peace.
- I am hidden and in safety.
- I keep out of sight.
- I live in concealment; live retired.
- I escape notice, remain unknown.
 - Bene qui latuit, bene vixit. – He who has well remained unknown has lived well.
- I am obscure or unknown, lie hidden.
 - Id qua ratione consecutus sit latet. – It is unknown how he obtained that.

Methodology?





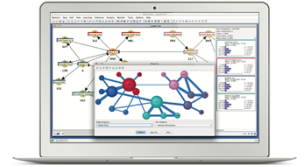
Why Bayesian Networks & BayesiaLab?

The New Paradigm: Bayesian Networks



Bayesian Networks
& BayesiaLab

STEFAN CONRADY | LIONEL JOUFFE



A Practical Introduction for Researchers

bayesia.us • bayesia.com • bayesia.sg

BAYESIAN NETWORKS*

Judea Pearl

Cognitive Systems Laboratory
Computer Science Department

University of California, Los Angeles, CA 90024

judea@cs.ucla.edu

Bayesian networks were developed in the late 1970's to model distributed processing in reading comprehension, where both semantical expectations and contextual information can be combined to form a coherent interpretation. The inferences filled a void in expert systems technology and have since been widely used. Heckerman et al.

CAUSALITY

MODELS, REASONING,
AND INFERENCE



PROBABILISTIC REASONING
IN INTELLIGENT SYSTEMS:

Networks of Plausible Inference



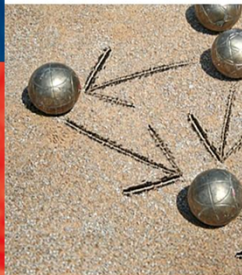
Studies in Computational Intelligence

Dawn E. Holmes
Lakhmi C. Jain (Eds.)

Innovations in
Bayesian Networks

Theory and Applications

Bayesian Networks
A Practical Guide to



WILEY

STATISTICS

Bayesian Networks

Editors
OLIVIER POURRET, PATRICK NAIM
AND BRUCE MARGOT

Computer Science and Data Analysis Series

Bayesian
Artificial
Intelligence
SECOND EDITION

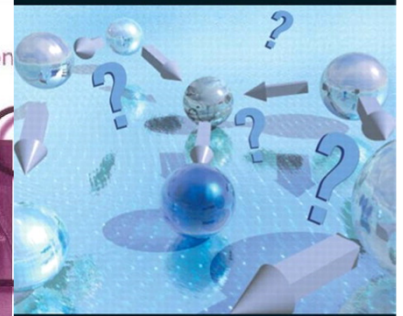
Kevin B. Korb
Ann E. Nicholson

PROBABILISTIC GRAPH
PRINCIPLES



BAYESIAN
NETWORKS

Causation, Prediction

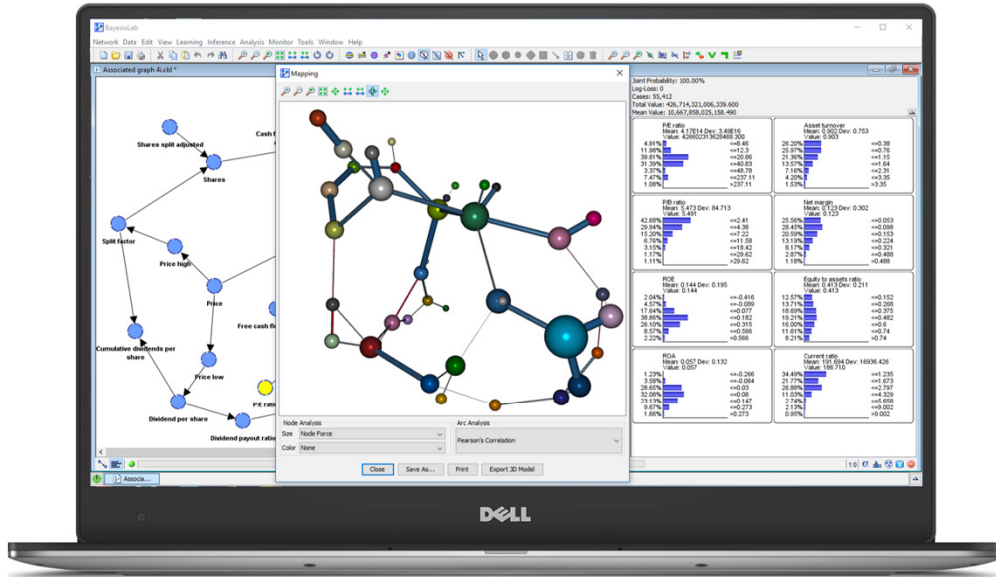


RICHARD E. NEAPOLITAN
PRENTICE HALL SERIES IN ARTIFICIAL INTELLIGENCE

Peter Spirtes,
Clark Glymour, and
Richard Scheines

tracking time series inference
uncertainty data mining statistics data
decision BAYESIAN REASONING
finance kernels clustering
sampling language classification trees
and algorithms labels
networks filtering recognition prediction
modelling robotics MATLAB
graphs LEARNING
bioinformatics computational intelligence

David Barber

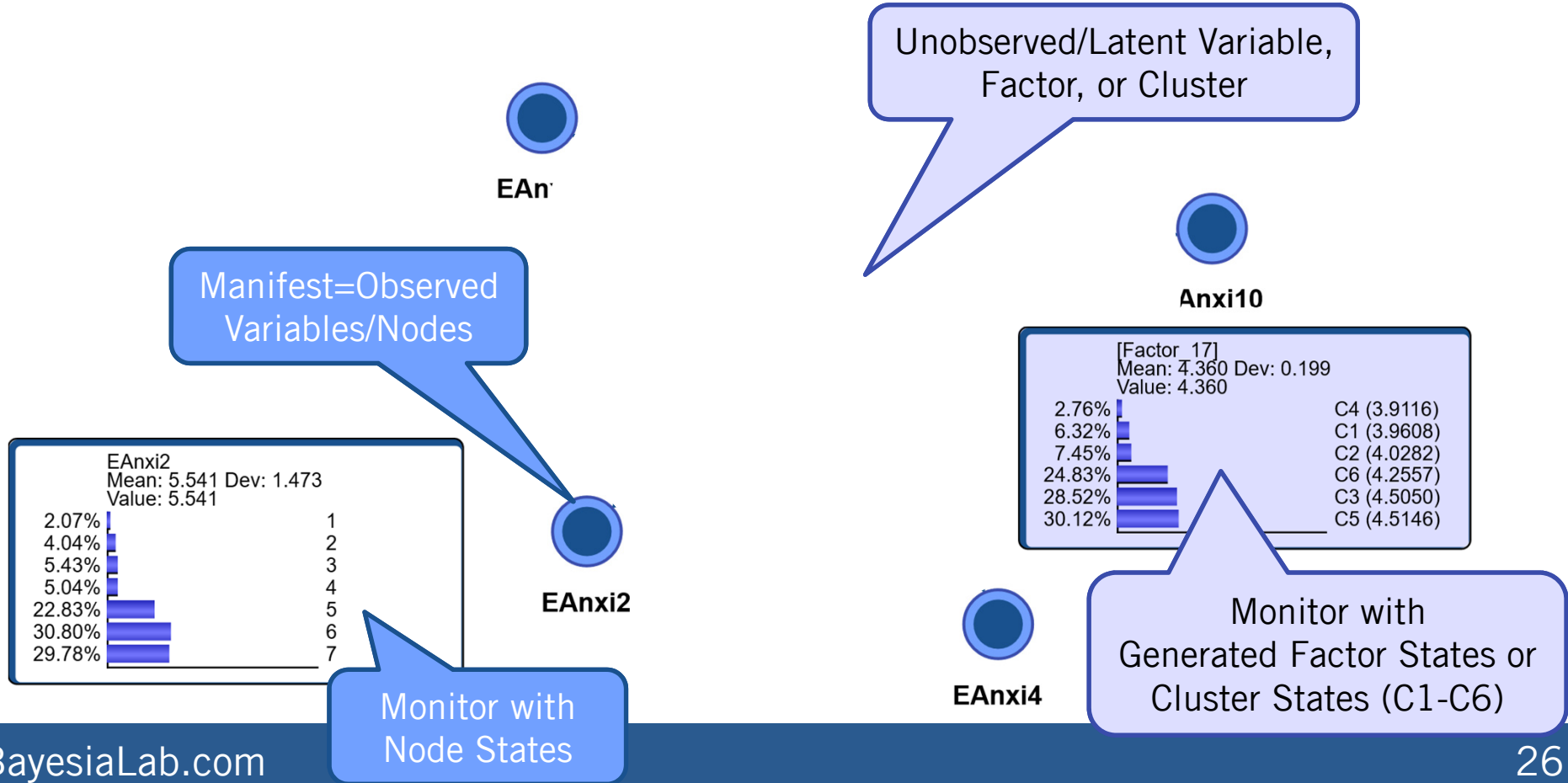


A desktop software for:

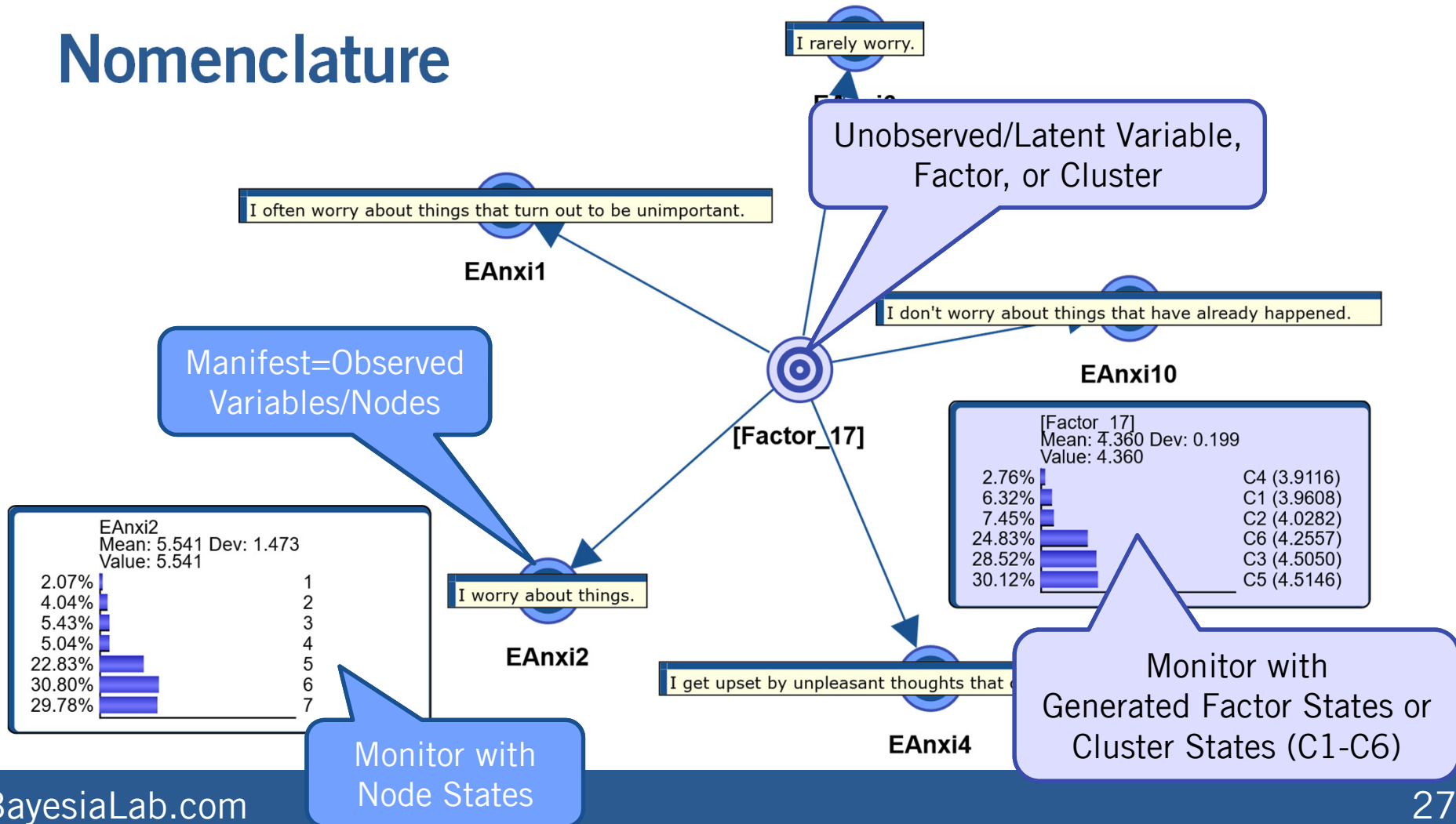
- encoding
- learning
- editing
- performing inference
- analyzing
- simulating
- optimizing

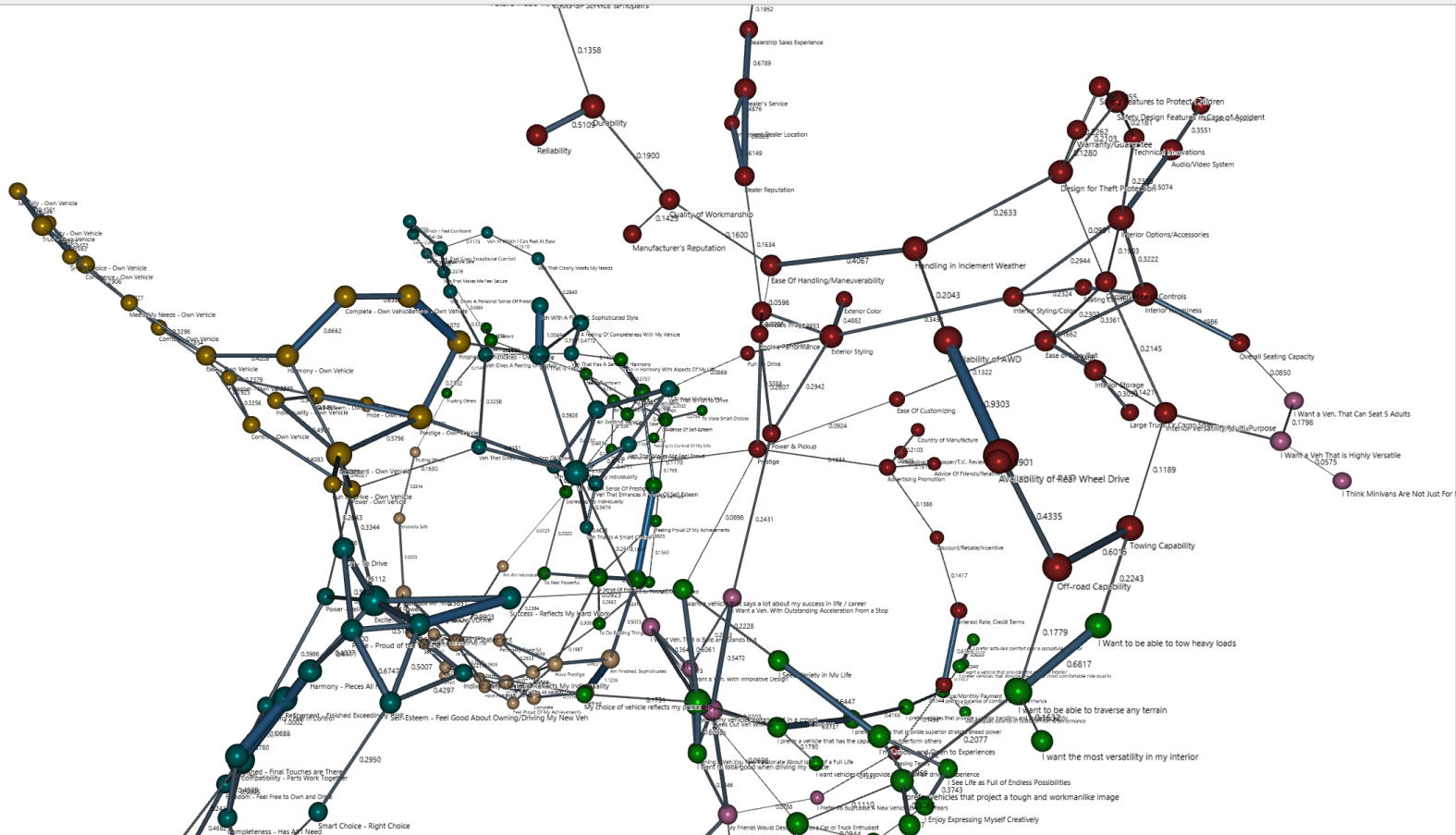
with **Bayesian networks.**

Nomenclature



Nomenclature





Node Analysis
 Size: Node Force
 Color: None

Arc Analysis
 Mutual Information

Bayesian Networks

Key Concepts Important for Factors Analysis

- As a Bayesian network represents a joint probability distribution, we can easily compute several information-theoretic measures with BayesiaLab:
 - Entropy
 - Mutual Information
 - **Arc Force**
 - Node Force
 - Etc.



***MAY THE
ARC FORCE
BE WITH YOU!***

Bayesian Networks

Key Concepts Important for Factors Analysis

- As a Bayesian network represents a joint probability distribution, we can easily compute several information-theoretic measures:

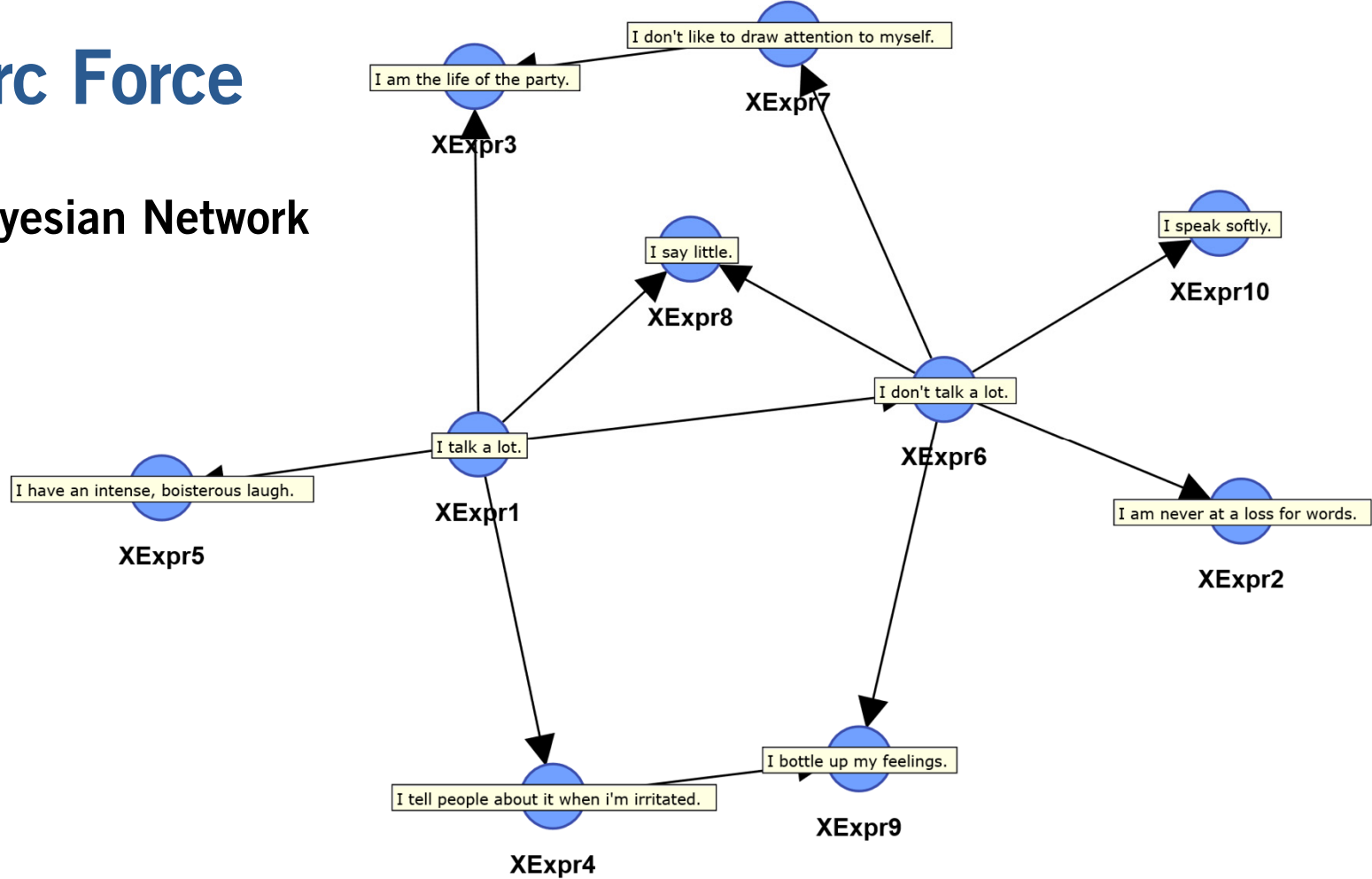
- Entropy
- Mutual Information
- **Arc Force**
- Node Force
- Etc.

Arc Force, a Measure of “Arc Importance”

- Arc Force is more formally known as “Kullback–Leibler Divergence.”
- It is the difference or distance in the joint distributions Q and P denoted $D_{KL}(P \parallel Q)$

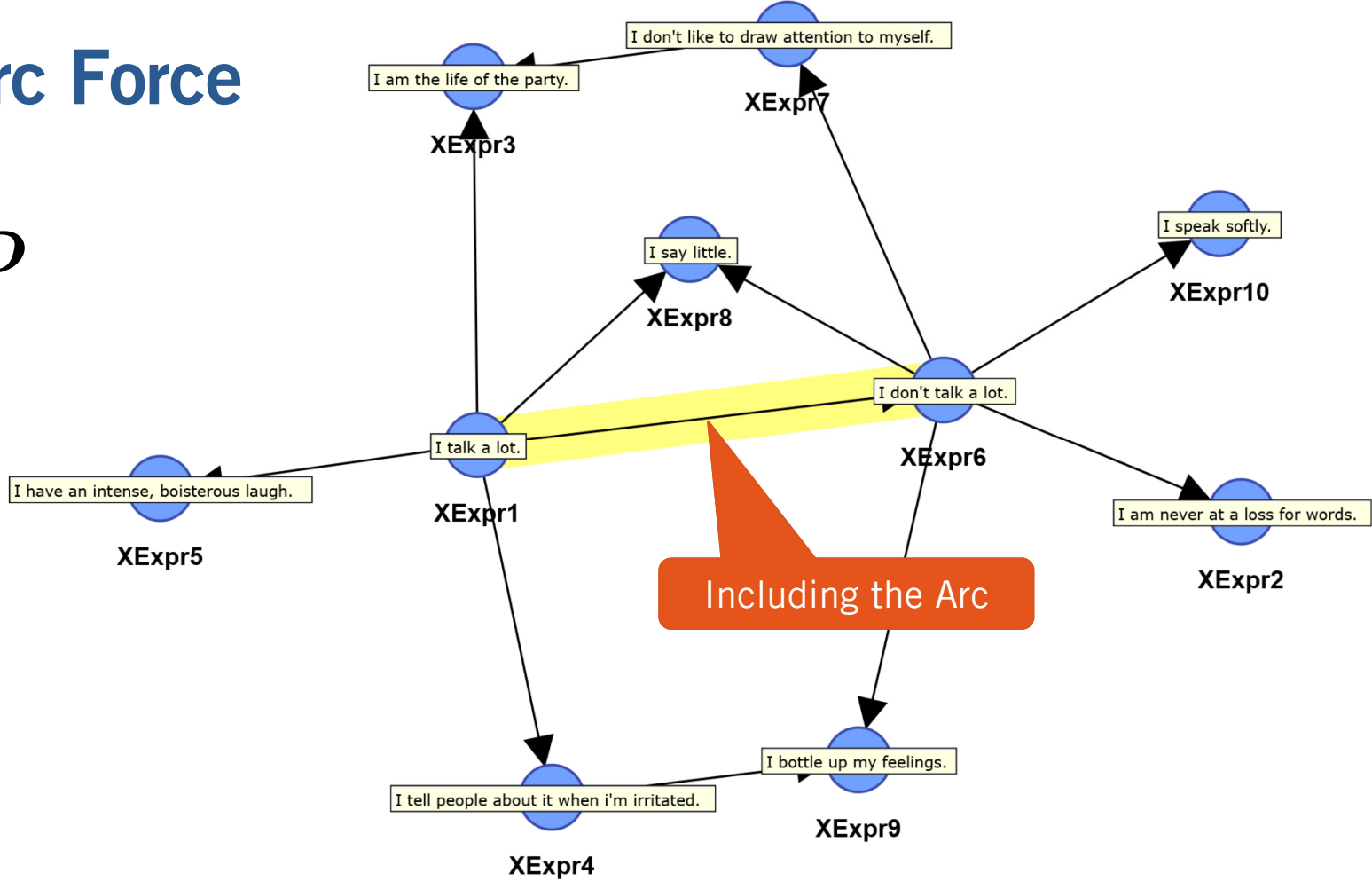
Arc Force

Bayesian Network



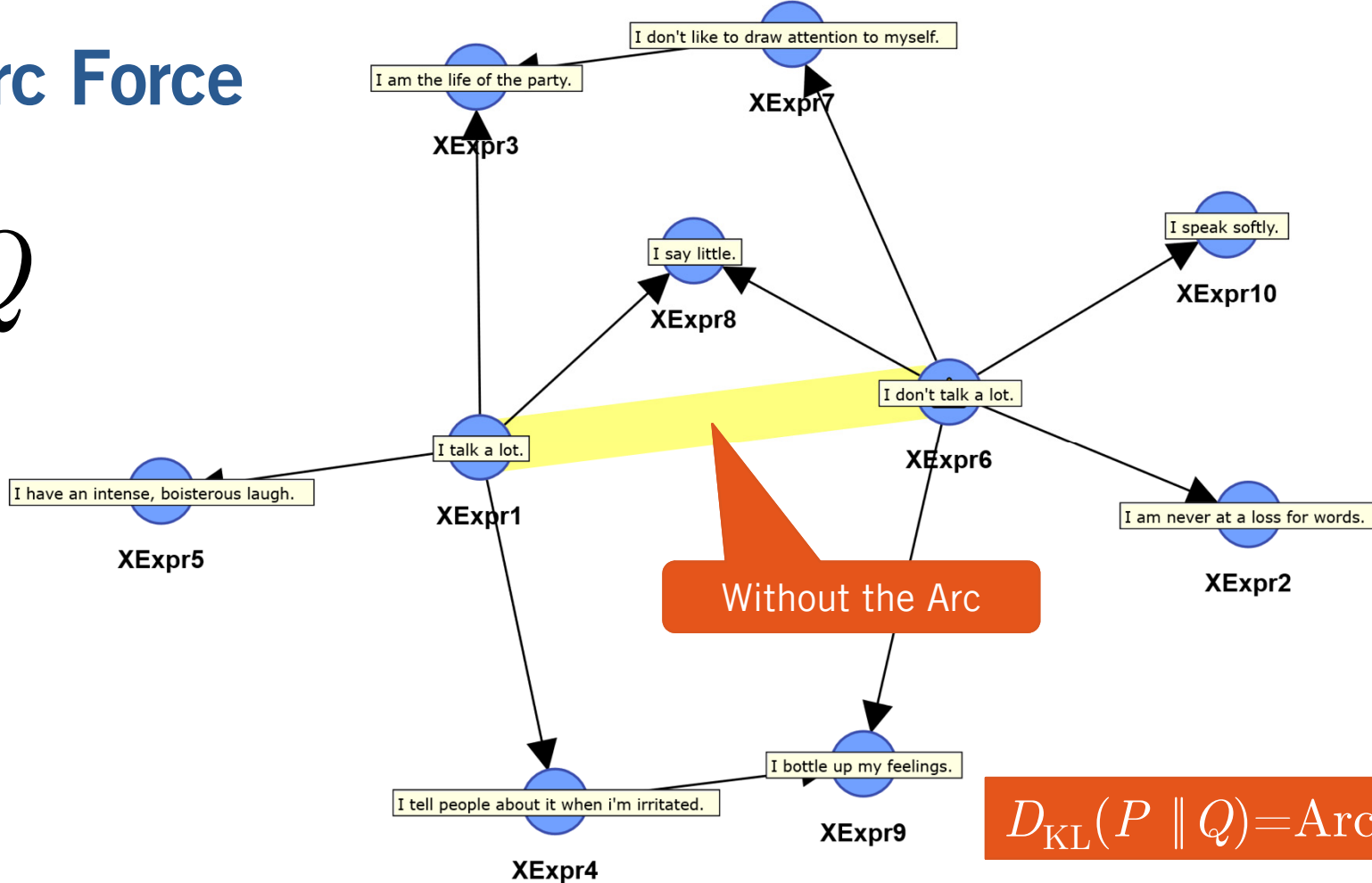
Arc Force

P



Arc Force

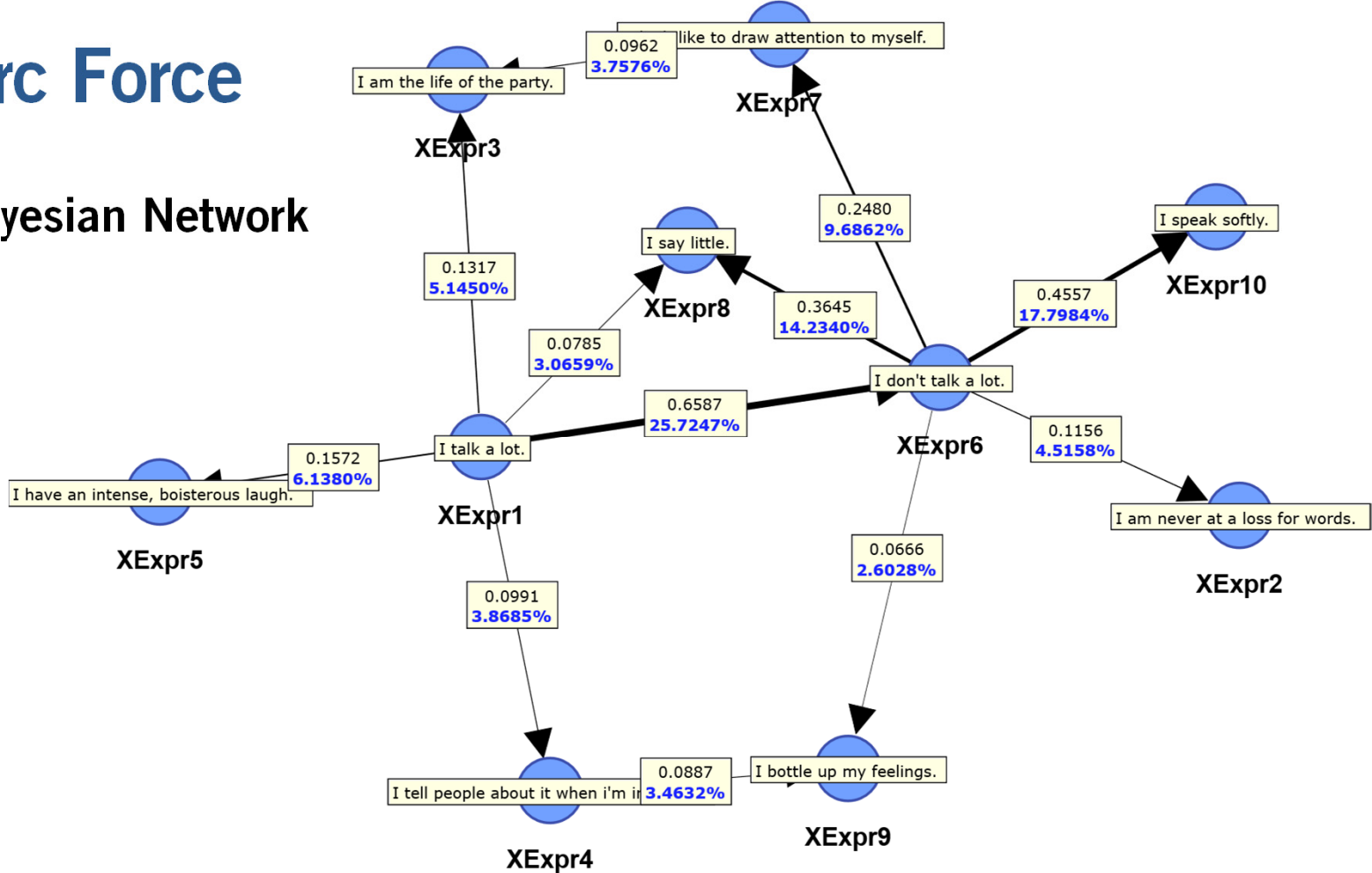
Q



$$D_{KL}(P \parallel Q) = \text{Arc Force}$$

Arc Force

Bayesian Network



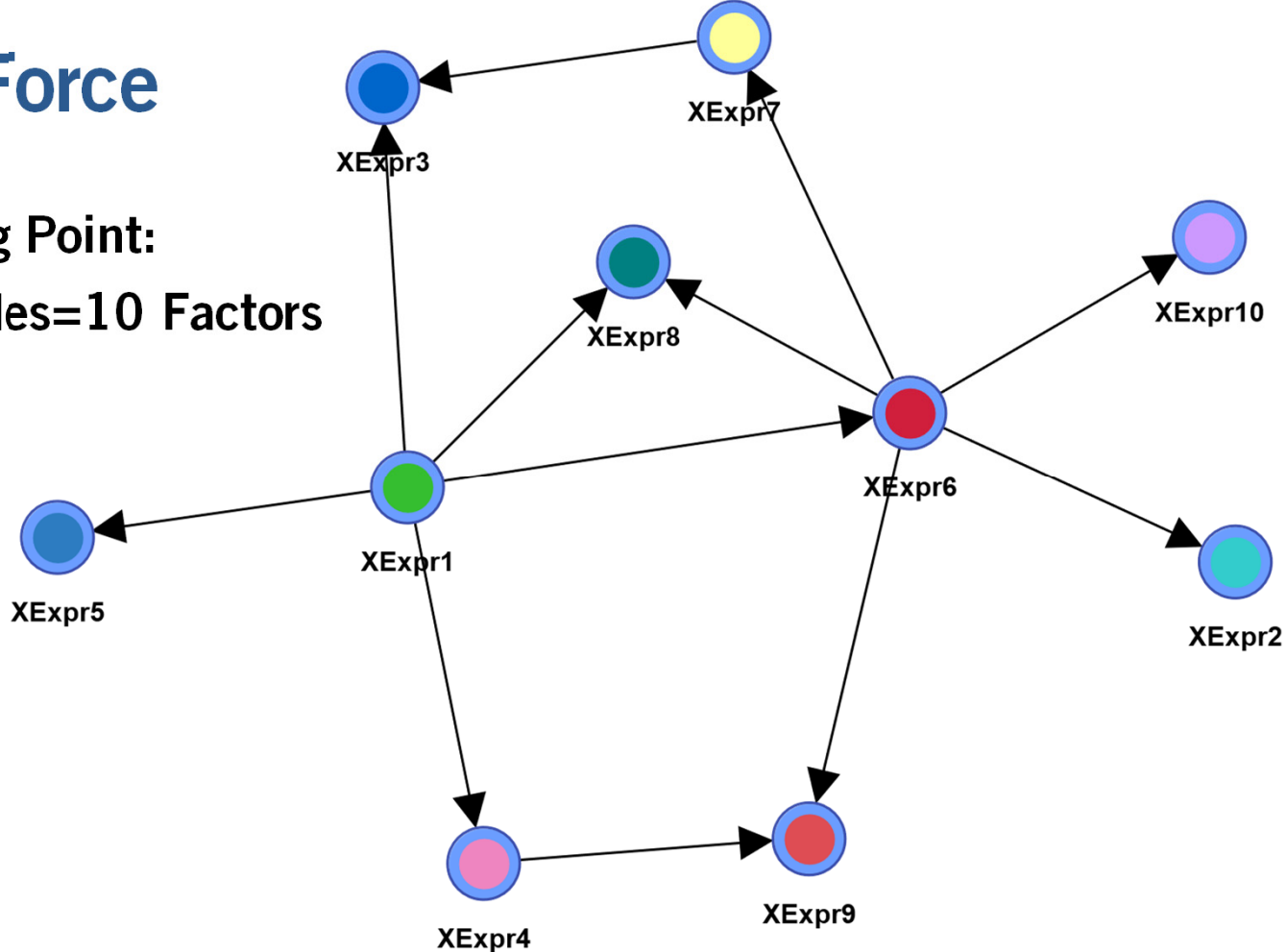
Arc Force



How does this
help with
clustering?

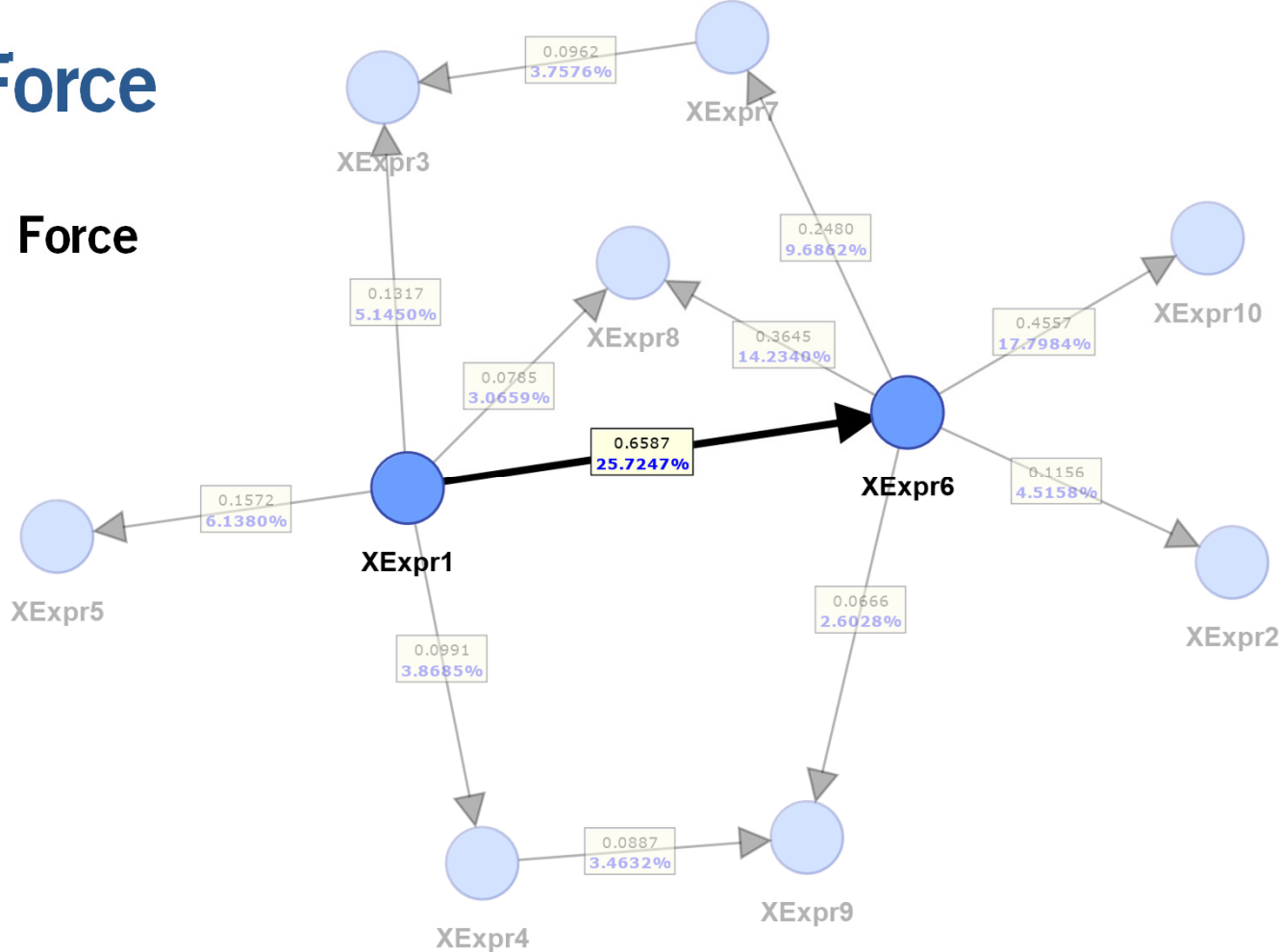
Arc Force

Starting Point:
10 Nodes=10 Factors



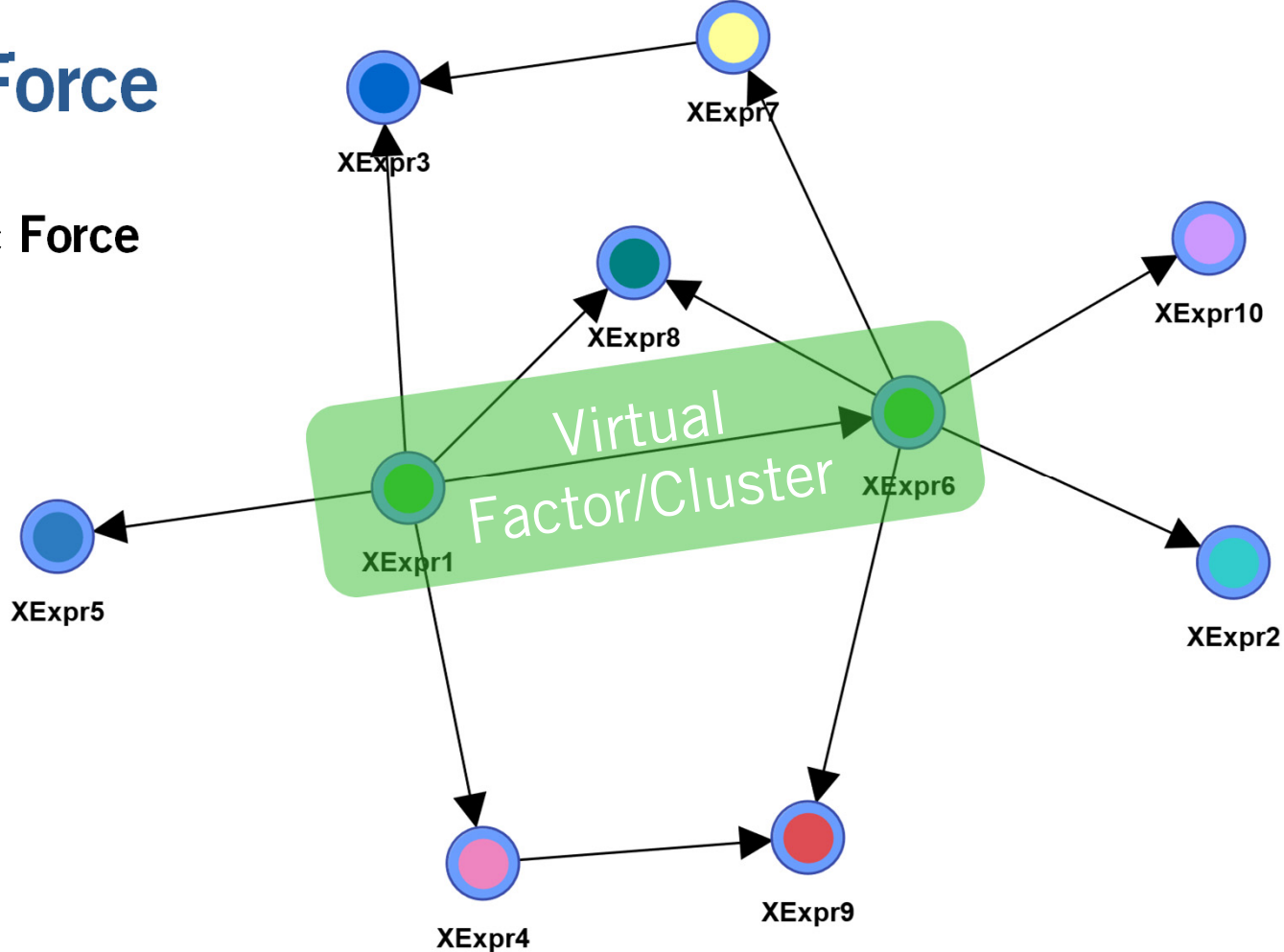
Arc Force

Top Arc Force



Arc Force

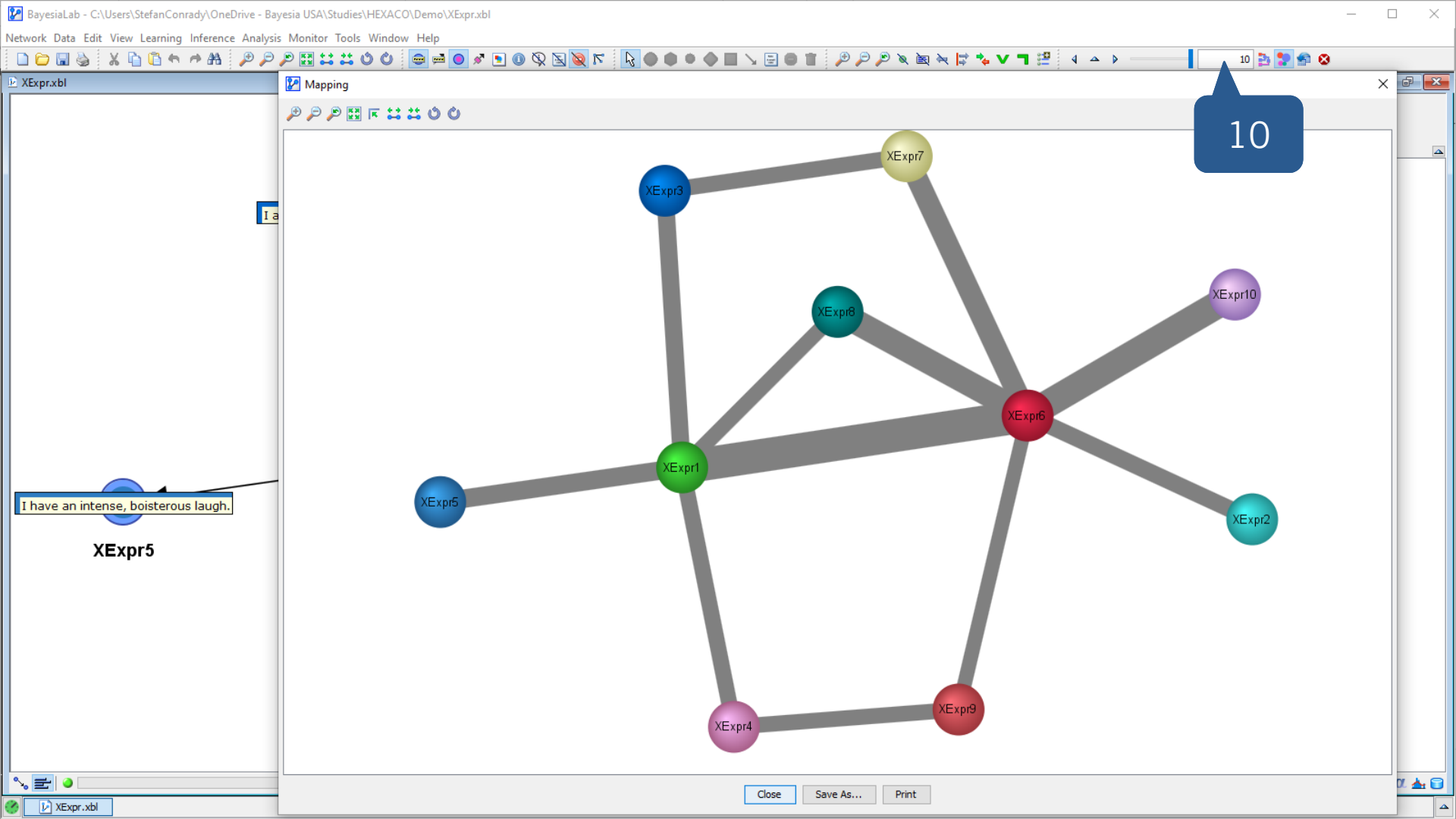
Top Arc Force

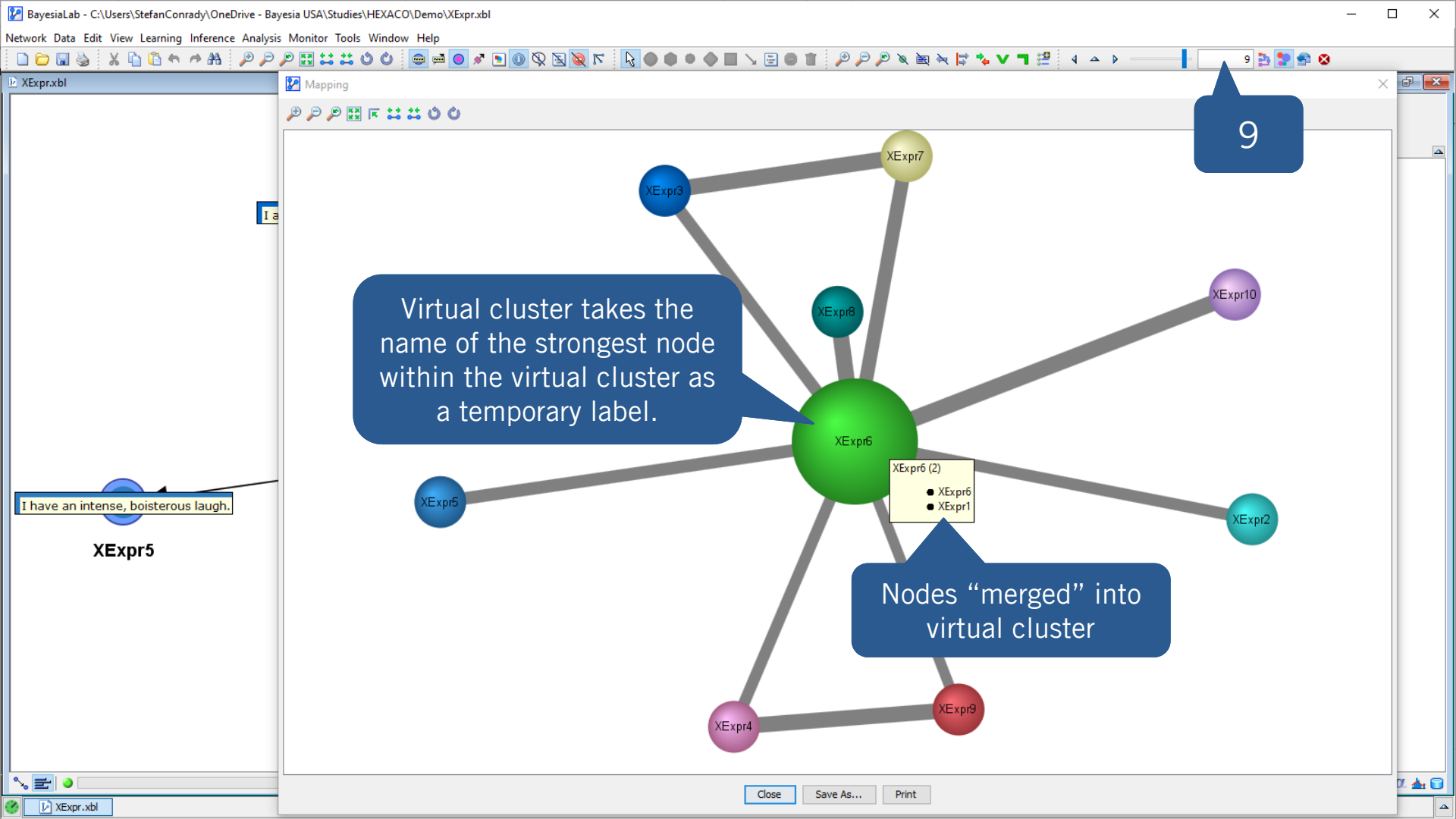


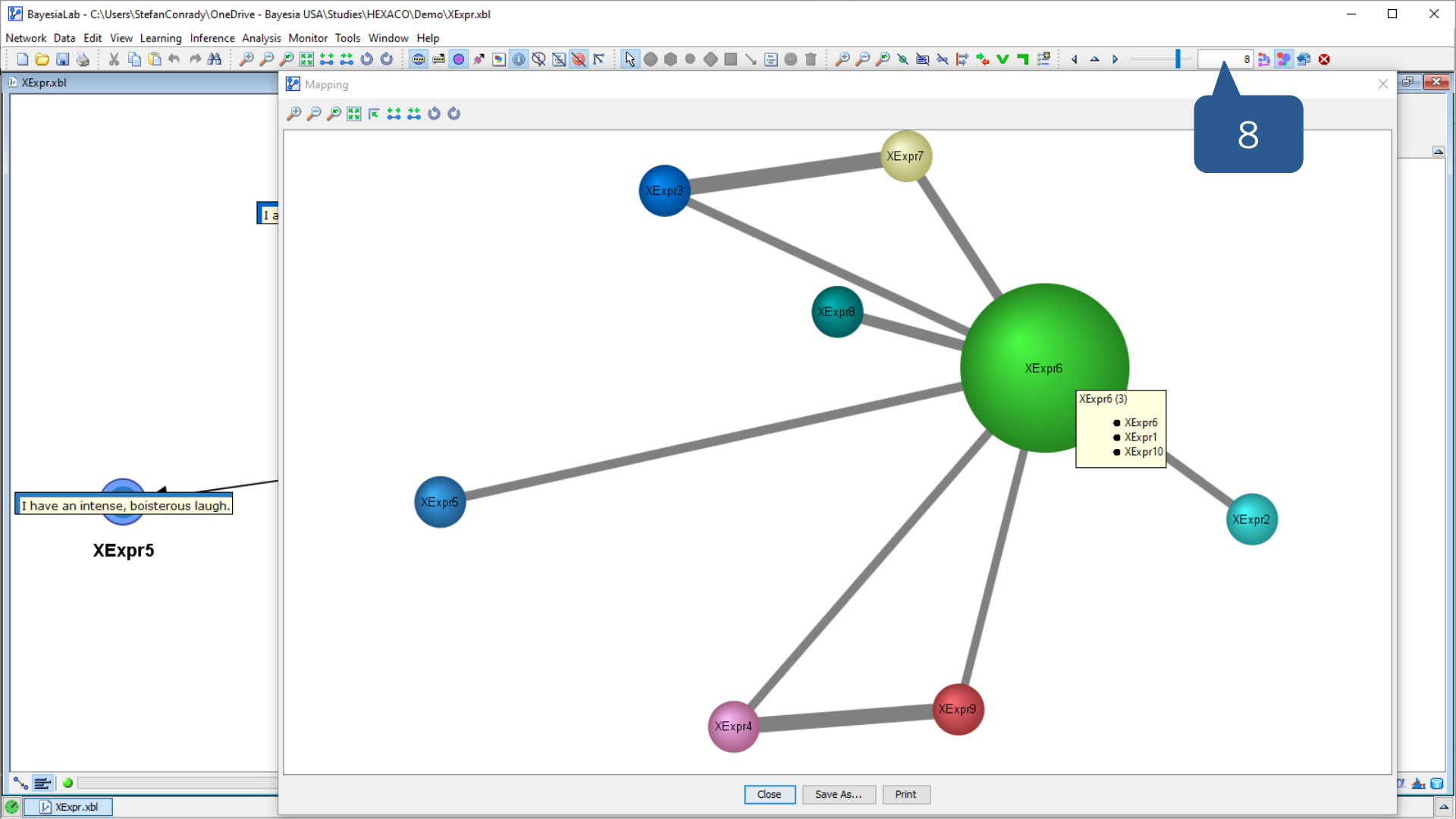
Arc Force

Using Arc Force for Variable Clustering

- BayesiaLab's Variable Clustering is a hierarchical agglomerative clustering algorithm that uses Arc Force (i.e., the Kullback-Leibler Divergence) for computing the distance between nodes.
- At the start of Variable Clustering, each manifest variable is treated as a distinct Factor or Cluster.
- The clustering algorithm proceeds iteratively by merging the “closest” Factors/Clusters into a new Factor/Cluster.





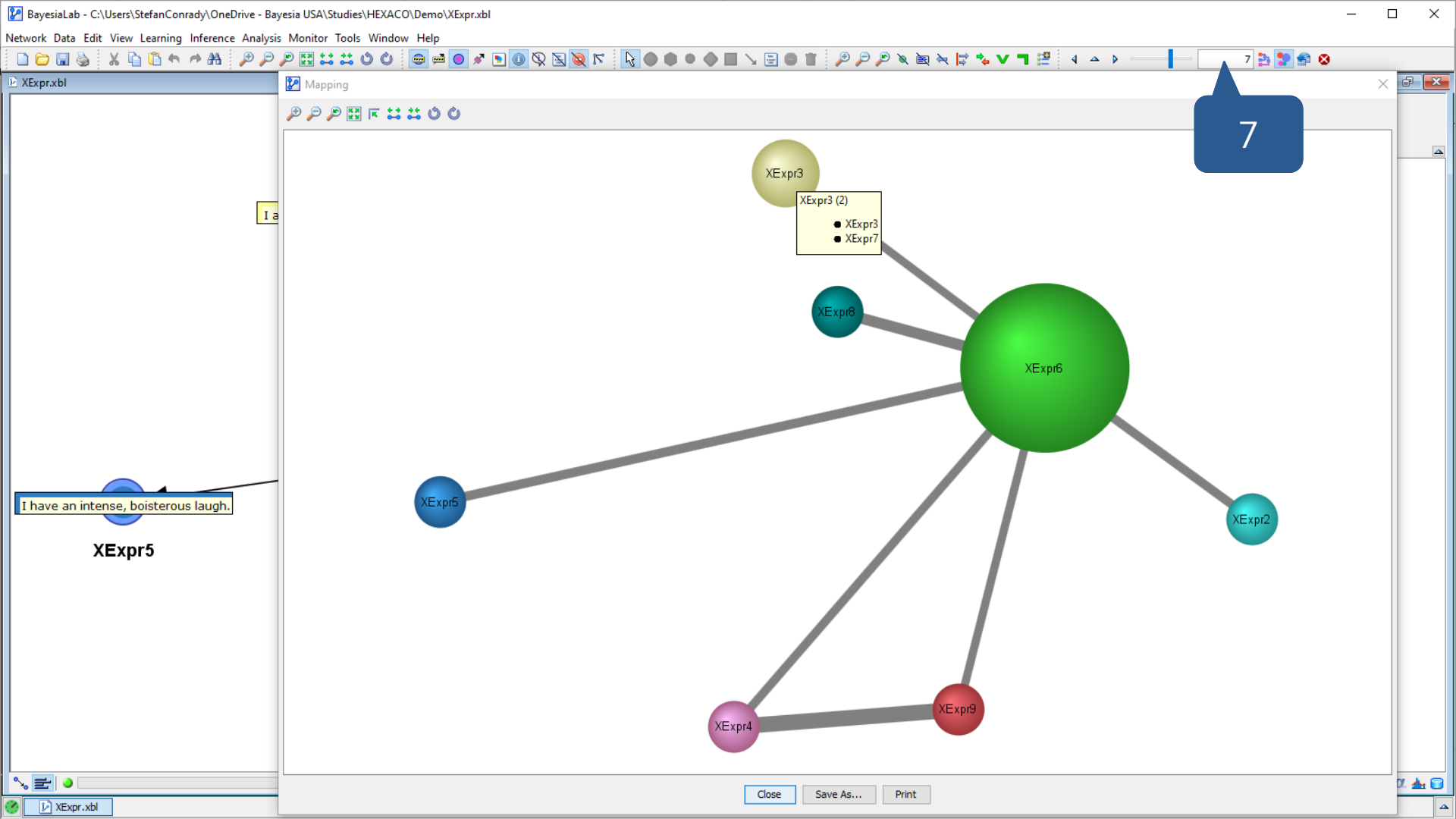


8

I have an intense, boisterous laugh.

XExpr5

- XExpr6 (3)
- XExpr6
 - XExpr1
 - XExpr10



7

I have an intense, boisterous laugh.

XExpr5

- XExpr3 (2)
- XExpr3
 - XExpr7

XExpr3

XExpr8

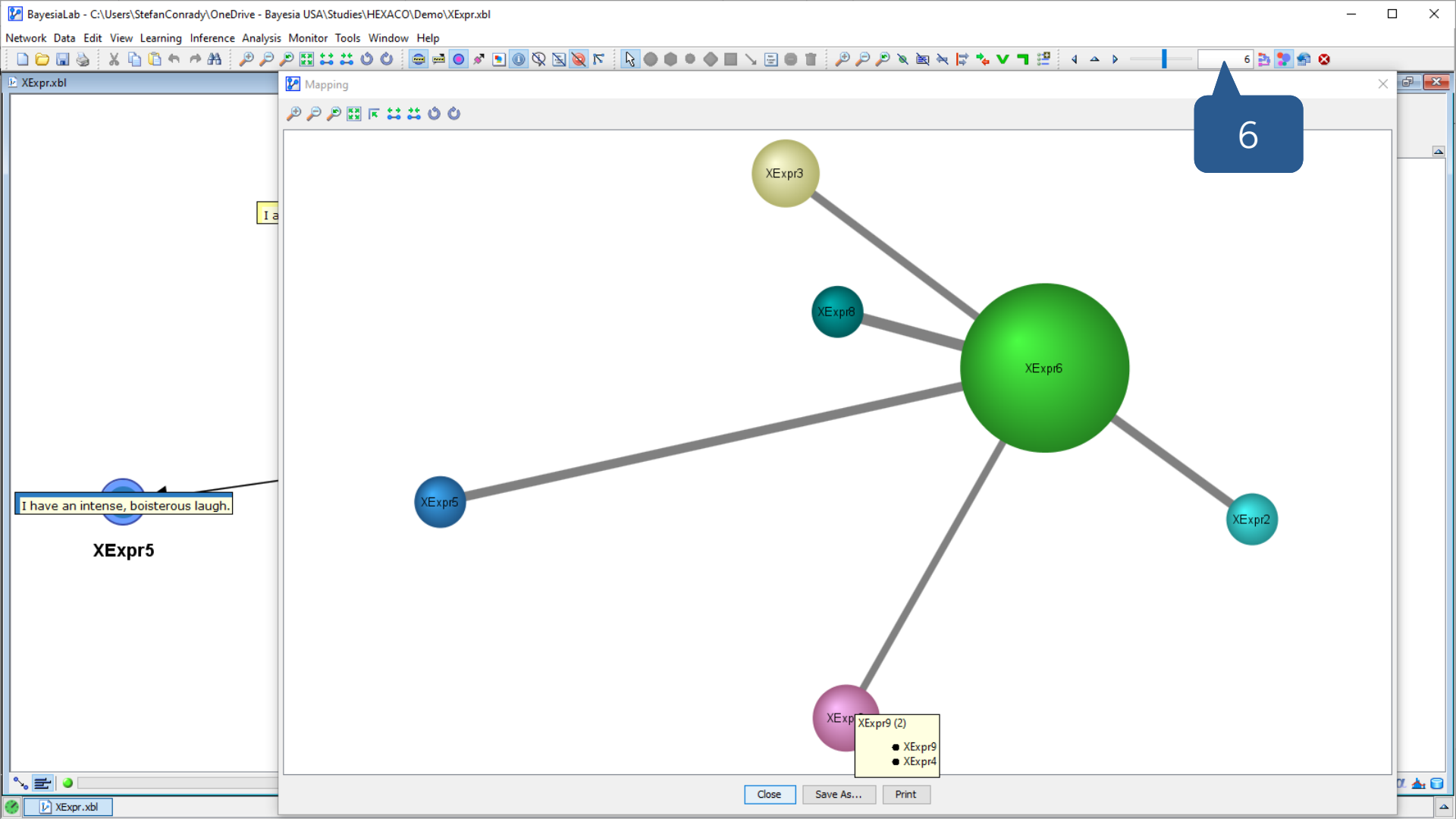
XExpr6

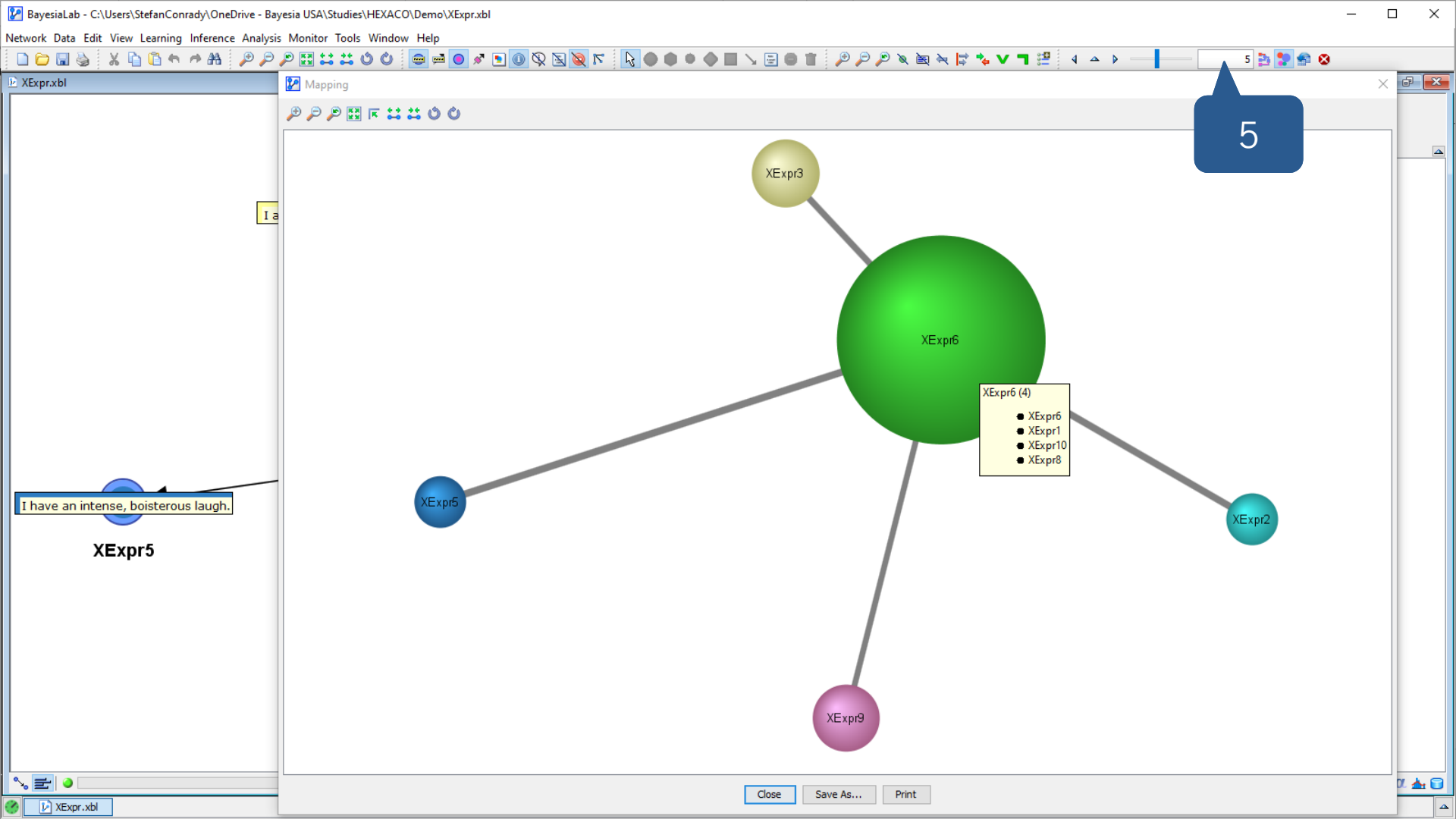
XExpr2

XExpr9

XExpr4

XExpr5





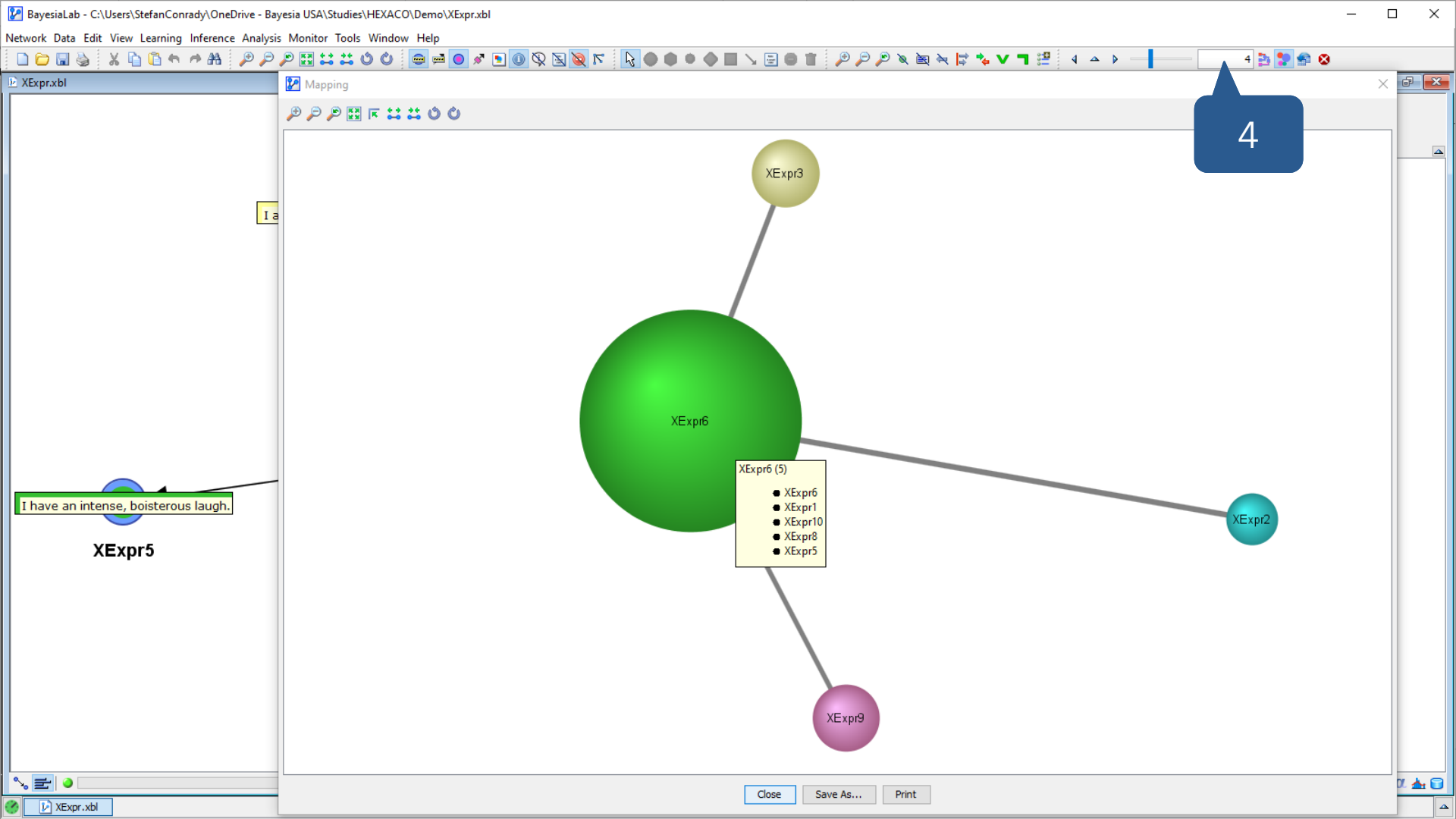
I have an intense, boisterous laugh.

XExpr5

Close Save As... Print

5

- XExpr6 (4)
- XExpr6
 - XExpr1
 - XExpr10
 - XExpr8



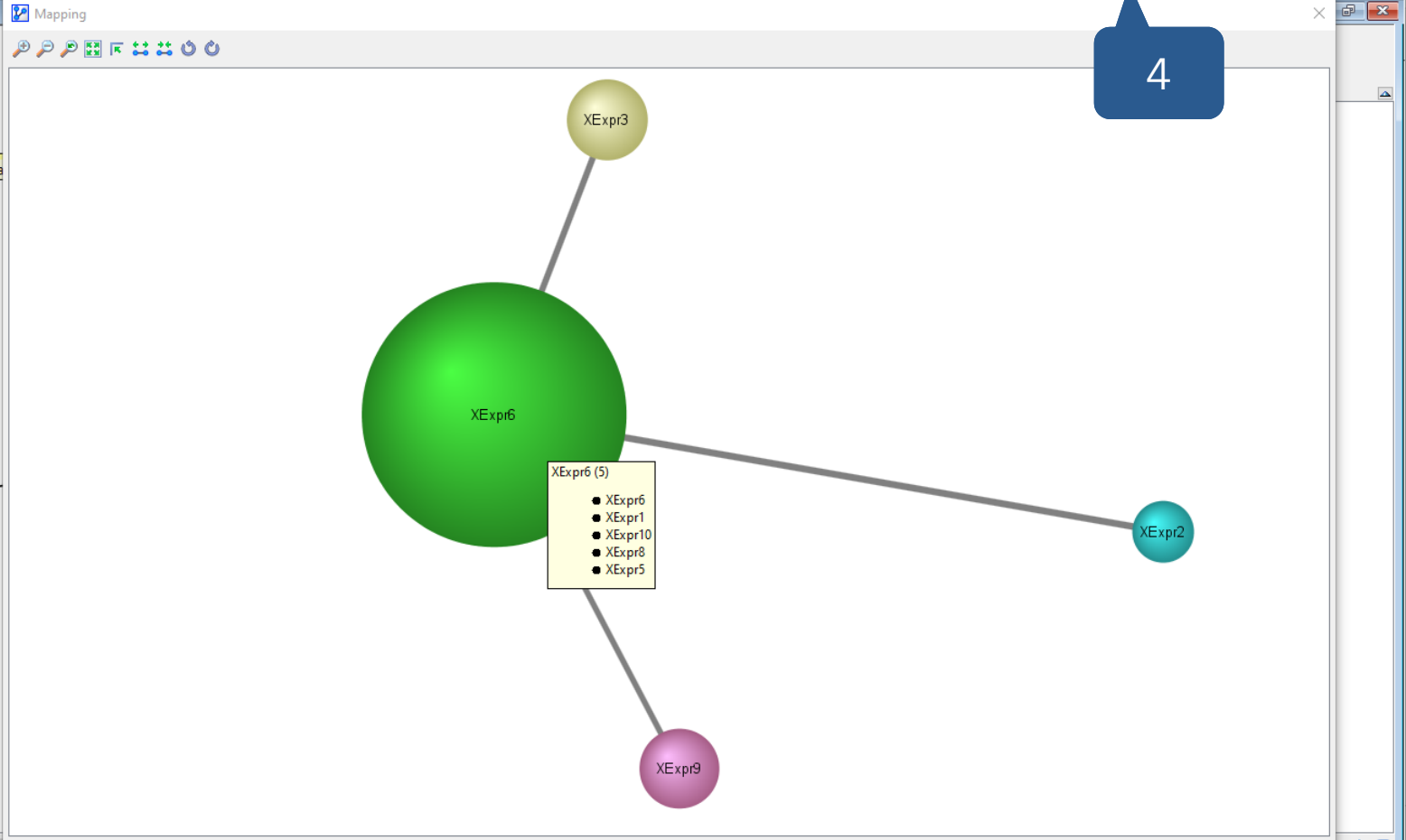
XExpr.xbl

I a

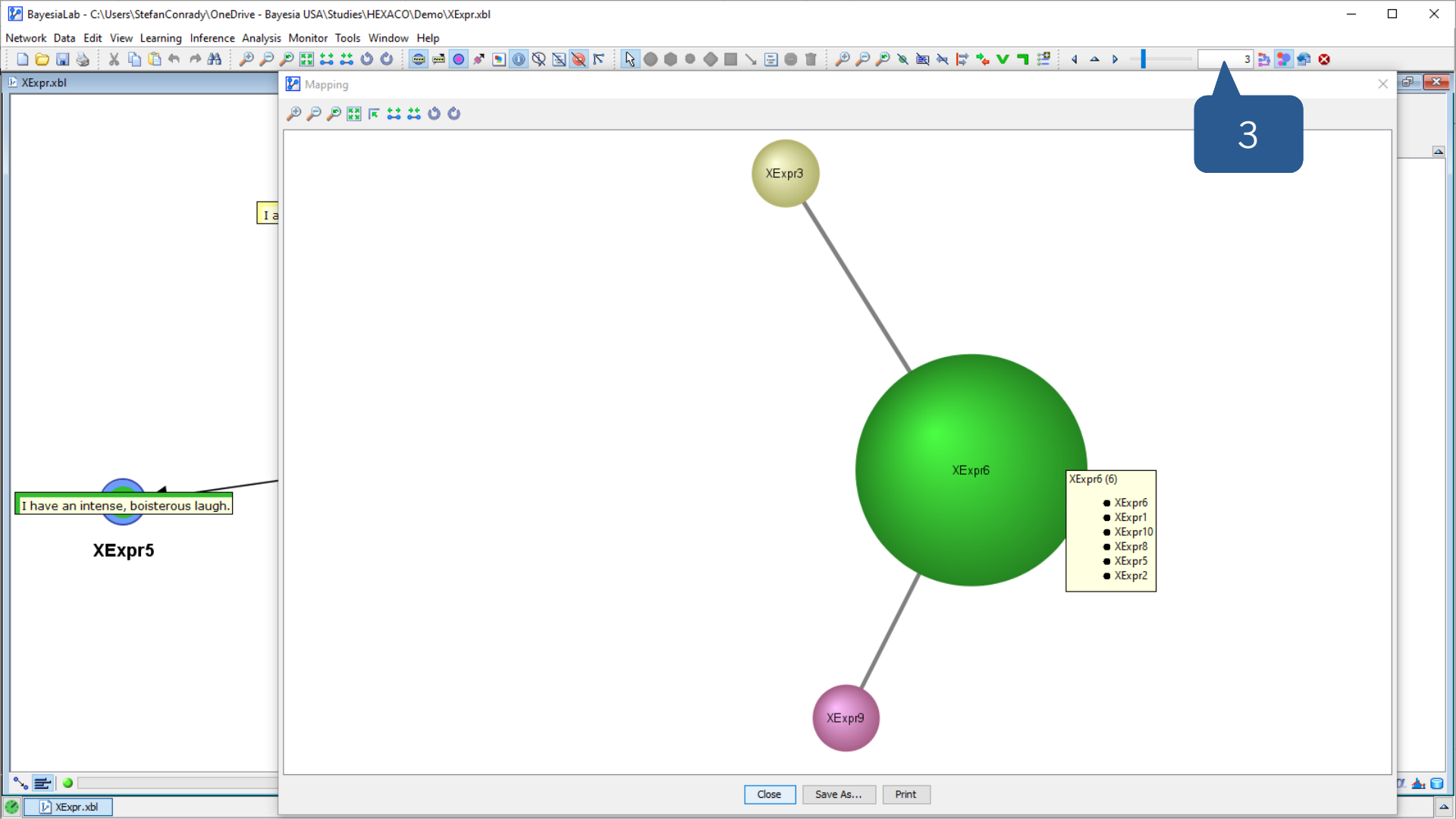
I have an intense, boisterous laugh.

XExpr5

XExpr.xbl



4



3

I have an intense, boisterous laugh.

XExpr5

Close Save As... Print

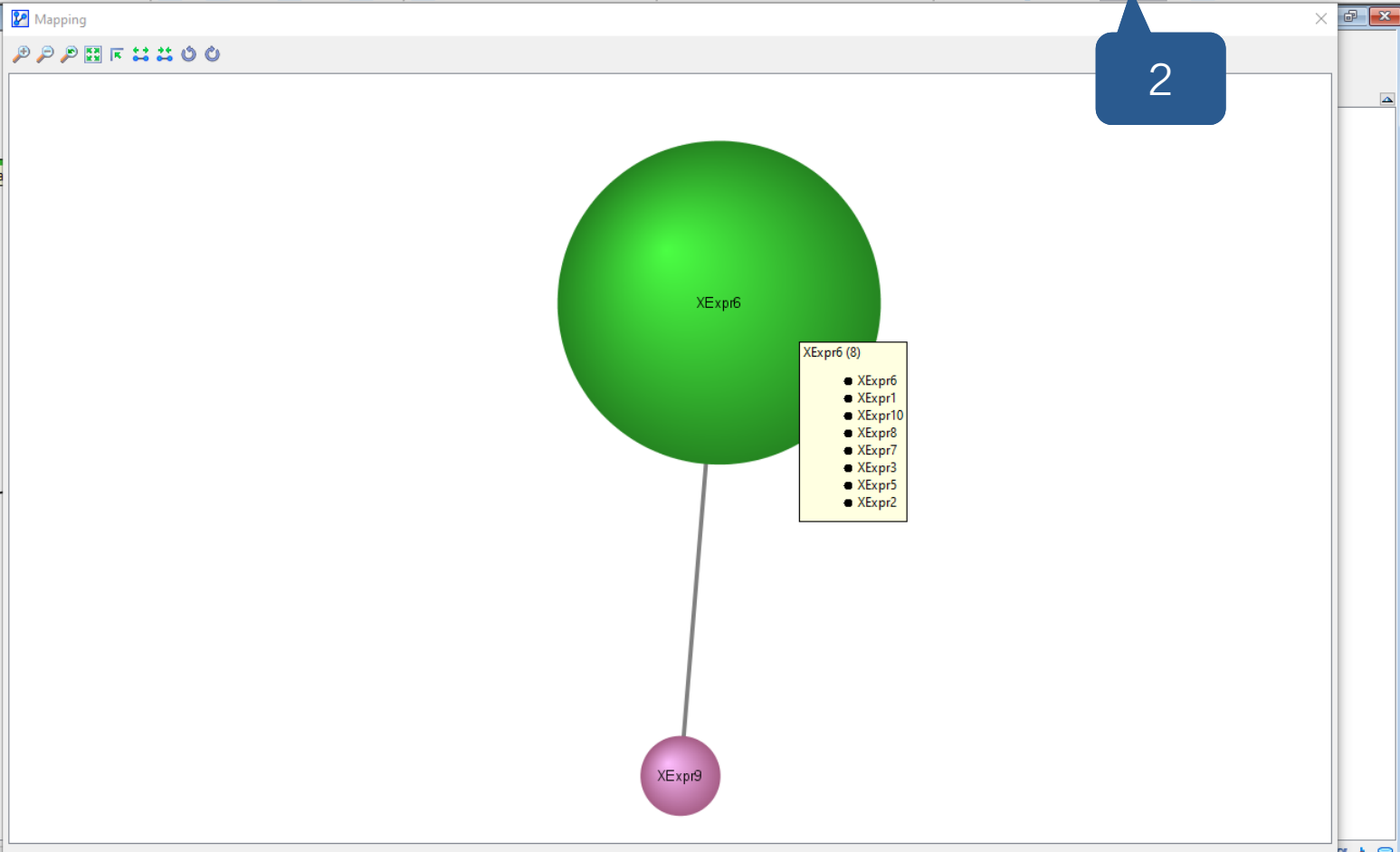
- XExpr6 (6)
- XExpr6
 - XExpr1
 - XExpr10
 - XExpr8
 - XExpr5
 - XExpr2



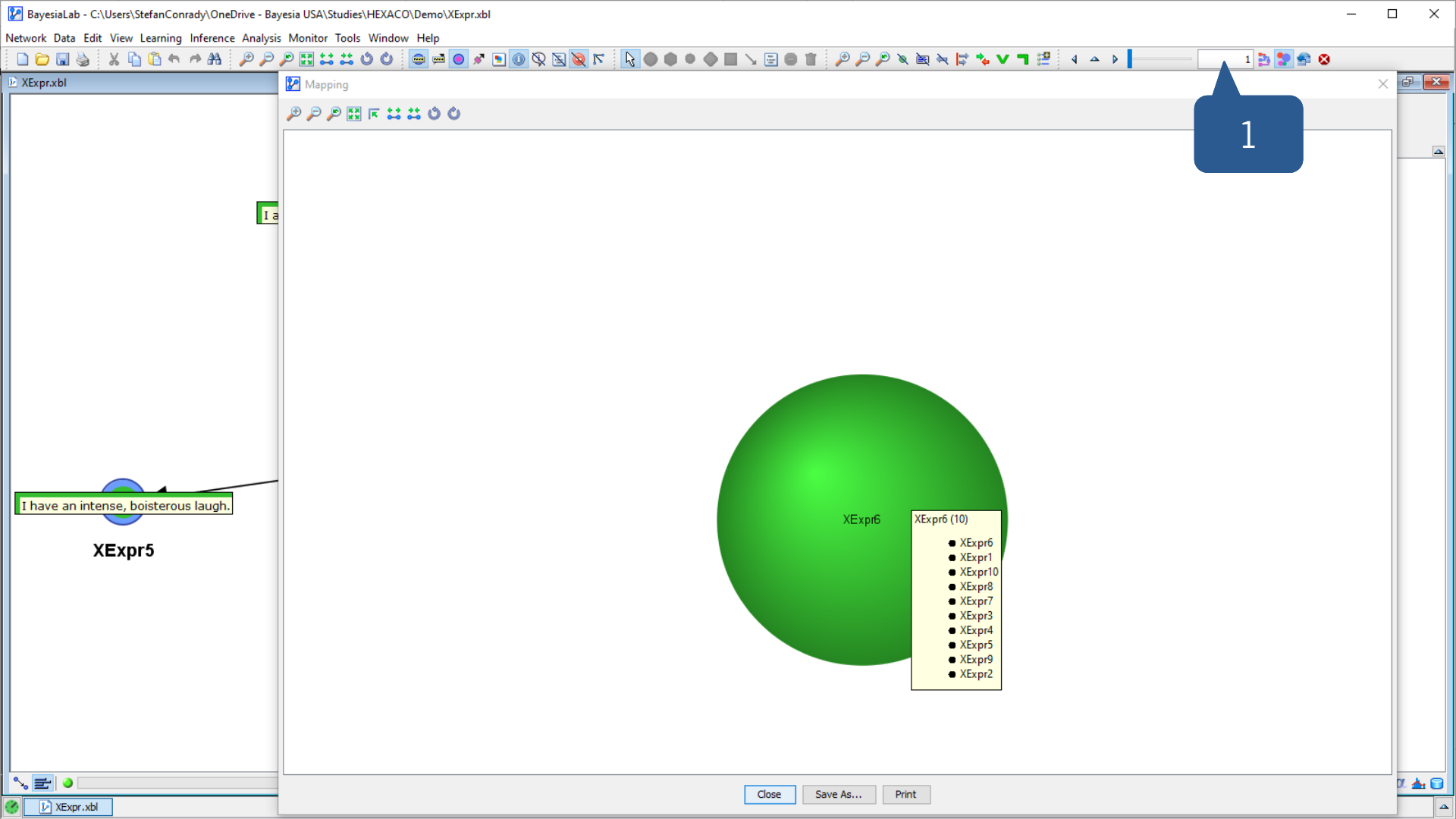
XExpr.xbl

I have an intense, boisterous laugh.

XExpr5



2



1

I have an intense, boisterous laugh.

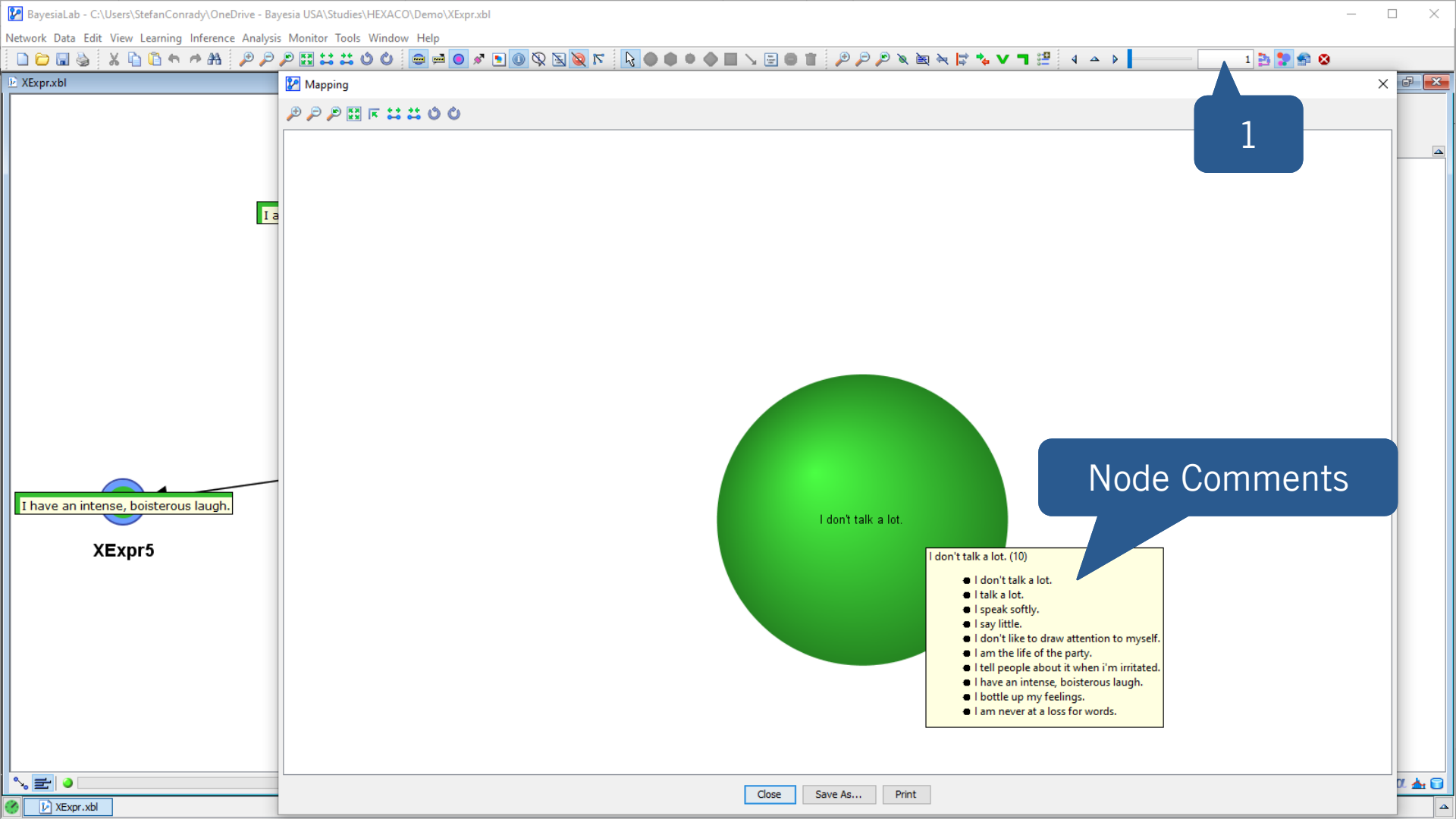
XExpr5

XExpr6

XExpr6 (10)

- XExpr6
- XExpr1
- XExpr10
- XExpr8
- XExpr7
- XExpr3
- XExpr4
- XExpr5
- XExpr9
- XExpr2

Close Save As... Print



1

Node Comments

- I don't talk a lot. (10)
- I don't talk a lot.
 - I talk a lot.
 - I speak softly.
 - I say little.
 - I don't like to draw attention to myself.
 - I am the life of the party.
 - I tell people about it when I'm irritated.
 - I have an intense, boisterous laugh.
 - I bottle up my feelings.
 - I am never at a loss for words.

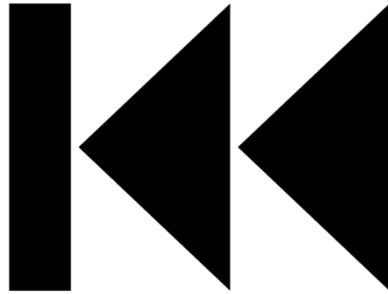
I have an intense, boisterous laugh.

XExpr5



But we need
a Bayesian
network
first, right?

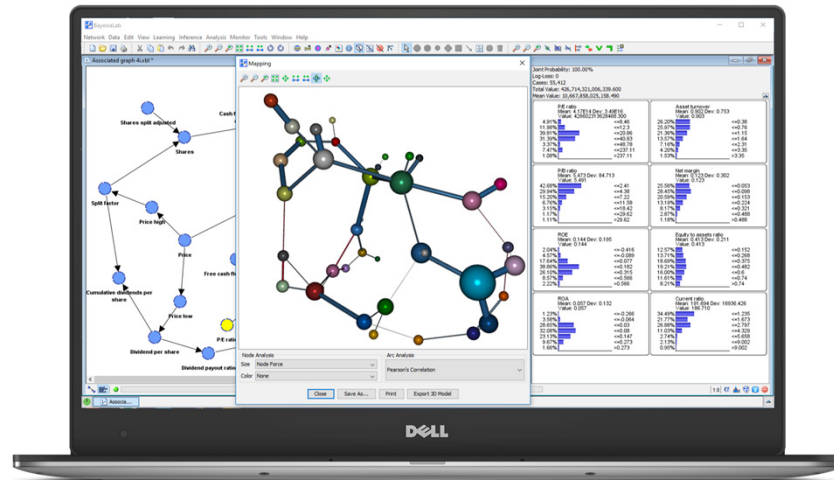
Rewind



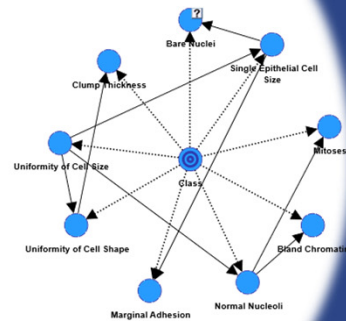
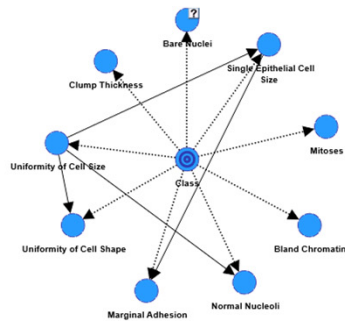
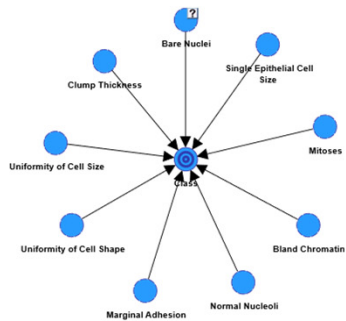
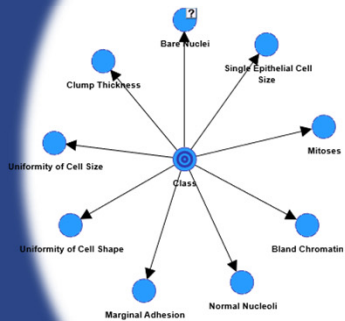
BayesiaLab Workflow

Workflow

- Machine-Learning
 - Minimum Description Length
- Clustering
 - Arc Force
- Validation
 - Log Loss
 - Contingency Table Fit
 - Purity
- Visualization & Interpretation



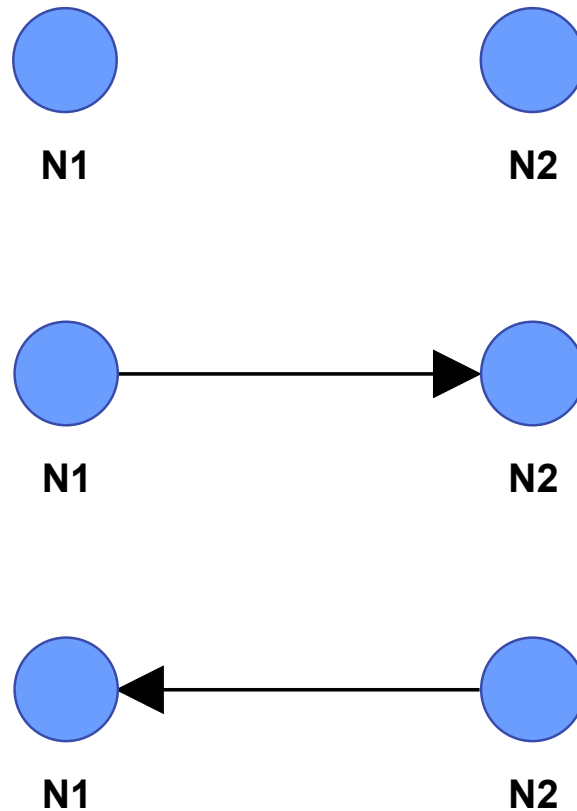
Learning=Searching



Learning=Searching

Number of Possible Networks

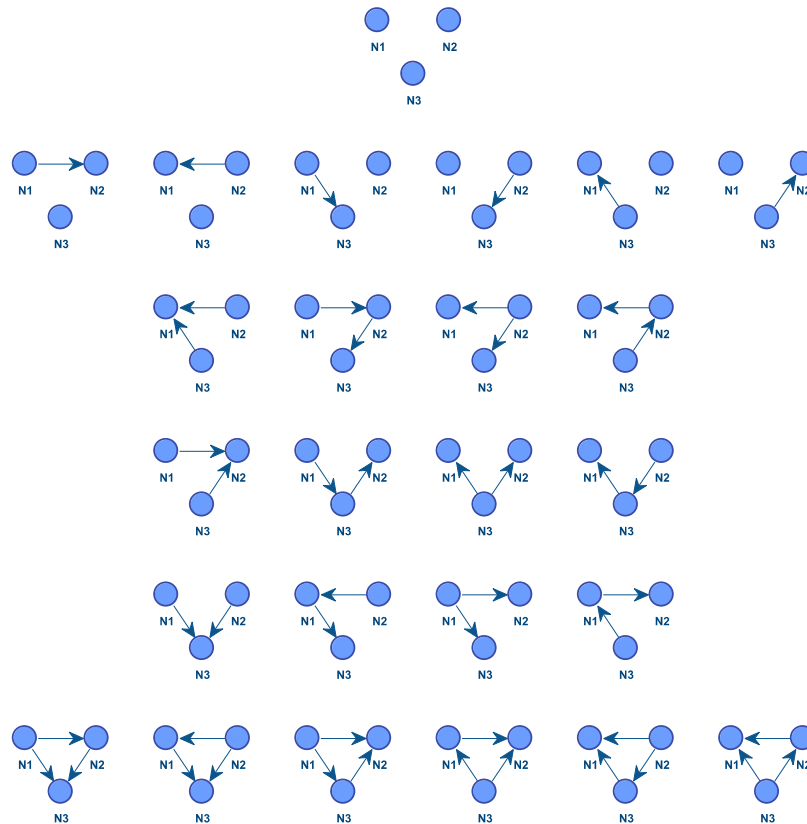
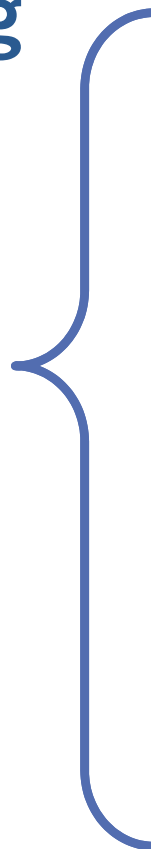
- 2 Nodes: 3



Learning=Searching

Number of Possible Networks

- 2 Nodes: 3
- 3 Nodes: 25



Learning=Searching

Number of Possible Bayesian Networks

- 2 Nodes: 3
- 3 Nodes: 25
- 4 Nodes: 543
- 5 Nodes: 29,281
- 6 Nodes: 3.8×10^6
- 7 Nodes: 1.1×10^9
- 8 Nodes: 7.8×10^{11}
- 9 Nodes: 1.2×10^{15}
- 10 Nodes: 4.2×10^{18}
- 11 Nodes: 3.2×10^{22}
- \vdots
- \vdots
- 240 Nodes: 9.1×10^{9060}

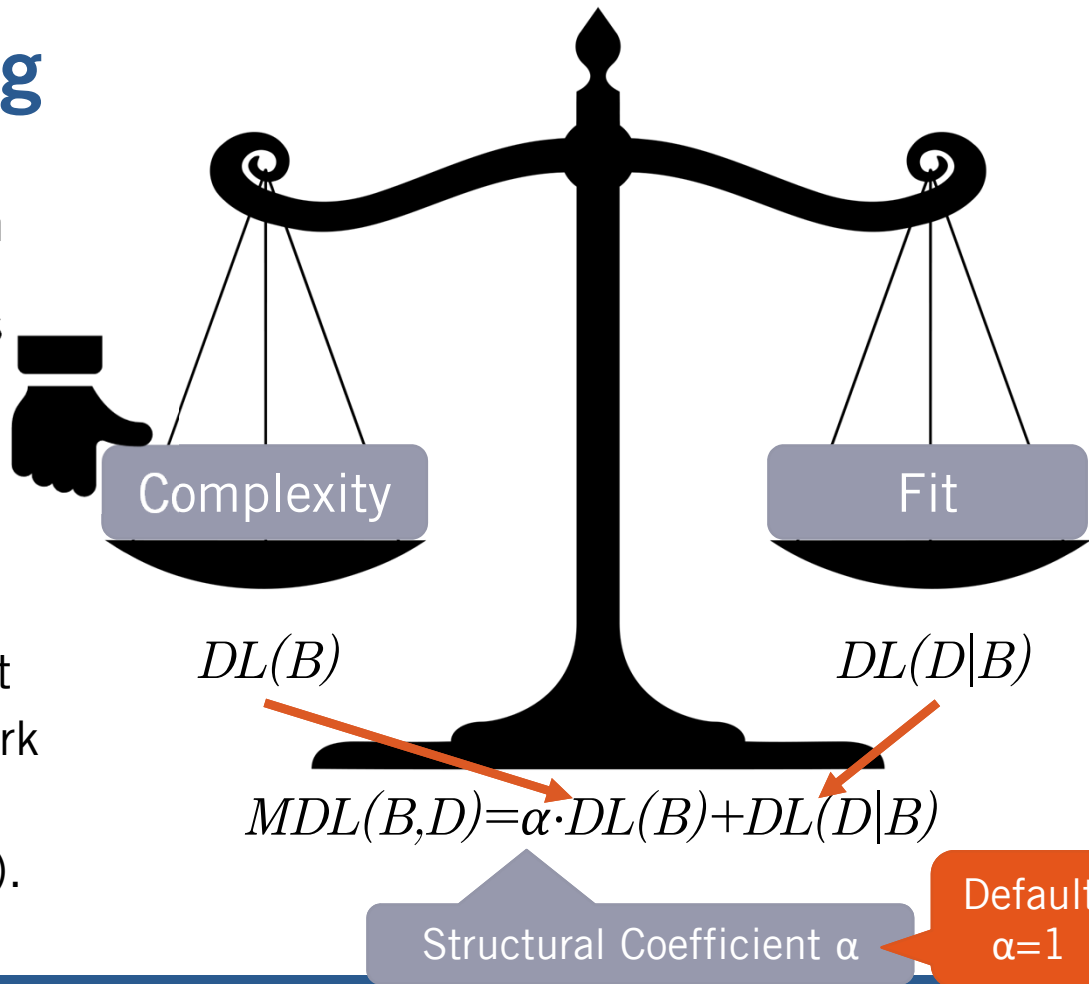
Search Space



Learning=Searching

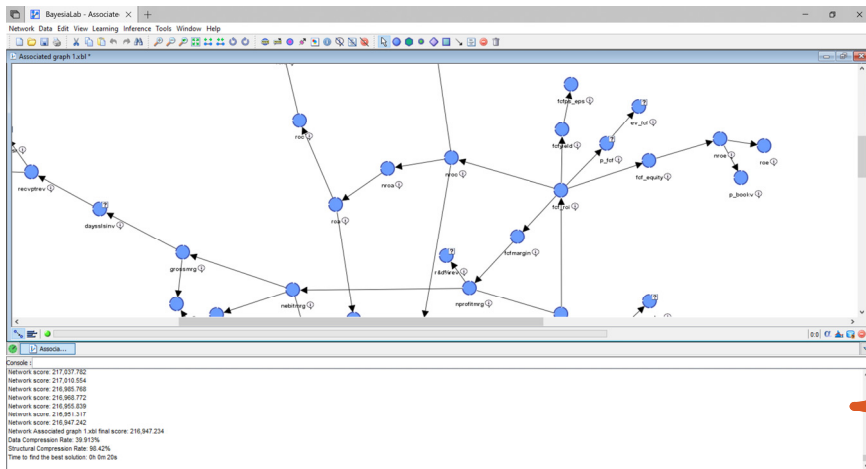
Minimum Description Length

- $DL(B)$ is the number of bits to represent the Bayesian network B (graph and probabilities), and
- $DL(D|B)$ is the number of bits to represent the dataset D given the Bayesian network B (likelihood of the data given the Bayesian network).



Learning=Searching

Minimum Description Length



Network score: 217,884.553
Network score: 217,743.338
Network score: 217,610.856
Network score: 217,483.237
Network score: 217,359.875
Network score: 217,241.952
Network score: 217,195.628
Network score: 217,152.903
Network score: 217,113.827
Network score: 217,075.16
Network score: 217,037.782
Network score: 217,010.554
Network score: 216,985.768
Network score: 216,968.772
Network score: 216,955.839
Network score: 216,951.317
Network score: 216,947.242

Network Associated graph 1.xbl final score: 216,947.234
Data Compression Rate: 39.913%
Structural Compression Rate: 98.42%
Time to find the best solution: 0h 0m 20s

MDL Score

Data Import

Define Data Structure

Separators

Tab Semicolon Comma

Space Other

Encoding

UTF-8

Options

Title Line

End of Line Character

Consider Identical Consecutive separators as a Unique One

Consider Different Consecutive Separators as a Unique One

Double Quote as String Delimiters

Single Quote as String Delimiters

Transpose

Missing Values

N/R

NR

NC

Filtered Values

VF

FV

N/A

Sampling

Learning/Test

Data

HSinc1	HSinc2	HSinc3	HSinc4	HSinc5	HSinc6	HSinc7	HSinc8	HSinc9	HSinc10
2	3	5	3	2	3	3	6	3	2
4	4	5	5	4	6	6	6	4	3
6	2	3	3	2	5	2	5	5	6
1	5	6	5	7	7	6	7	7	7
6	4	5	4	5	5	4	5	5	4
6	3	3	6	3	2	1	7	3	2
3	1	6	6	4	4	4	6	5	7
1	3	5	1	3	2	1	5	5	2
5	3	5	7	4	1	6	5	1	5
5	3	4	4	4	4	1	6	3	3
3	1	3	2	6	2	5	6	4	1
6	4	4	2	1	3	2	5	5	1

Data Import
✕

Define Variable Type

Type

Not Distributed

Discrete

Continuous

Weight

Learning/Test

Row Identifier

Action

Columns with Missing Values

All not Distributed

All Discrete

All Continuous

Information

Number of Rows	15017	100.00%
Not Distributed	0	0.00%
Discrete	240	100.00%
Continuous	0	0.00%
Others	0	0.00%
Missing Values	0	0.00%
Filtered Values	0	0.00%

Data

HSinc1	HSinc2	HSinc3	HSinc4	HSinc5	HSinc6	HSinc7	HSinc8	HSinc9	HSinc10
2	3	5	3	2	3	3	6	3	2
4	4	5	5	4	6	6	6	4	3
6	2	3	3	2	5	2	5	5	6
1	5	6	5	7	7	6	7	7	6
6	4	5	4	5	5	4	5	5	4
6	3	3	6	3	2	1	7	3	2
3	1	6	6	4	4	4	6	5	7
1	3	5	1	3	2	1	5	5	2
5	3	5	7	4	1	6	5	1	5
5	3	4	4	4	4	1	6	3	3
3	1	3	2	6	2	5	6	4	1
6	4	4	2	1	3	2	5	5	1
7	2	1	2	1	1	1	3	4	1
4	2	3	2	7	2	1	4	1	1

Cancel
Previous
Next
Save
Finish

Data Import

Data Selection and Filtering

Missing Value Processing

Filter

OR

AND

Replace by :

Value

Mean/Modal

Infer

- Static Imputation
- Dynamic Imputation
- Structural EM
- Entropy-Based Static Imputation
- Entropy-Based Dynamic Imputation

Information

Number of Rows	15017	100.00%
Not Distributed	0	0.00%
Discrete	240	100.00%
Continuous	0	0.00%
Others	0	0.00%
Missing Values	0	0.00%
Filtered Values	0	0.00%

Select Values

OR

AND

Data

HSinc1 ▾	HSinc2 ▾	HSinc3 ▾	HSinc4 ▾	HSinc5 ▾	HSinc6 ▾	HSinc7 ▾	HSinc8 ▾	HSinc9 ▾	HSinc10 ▾
2	3	5	3	2	3	3	6	3	2
4	4	5	5	4	6	6	6	4	3
6	2	3	3	2	5	2	5	5	6
1	5	6	5	7	6	7	7	7	7
6	4	5	4	5	5	4	5	5	4

Data Import

Discretization and Aggregation

Aggregation

States (7)

1
2
3
4
5
6
7

Aggregates (0)

Display Correlations

Target: AFlex1

State: []

Automatic Aggregation

Aggregate

Delete

Transfer Aggregates

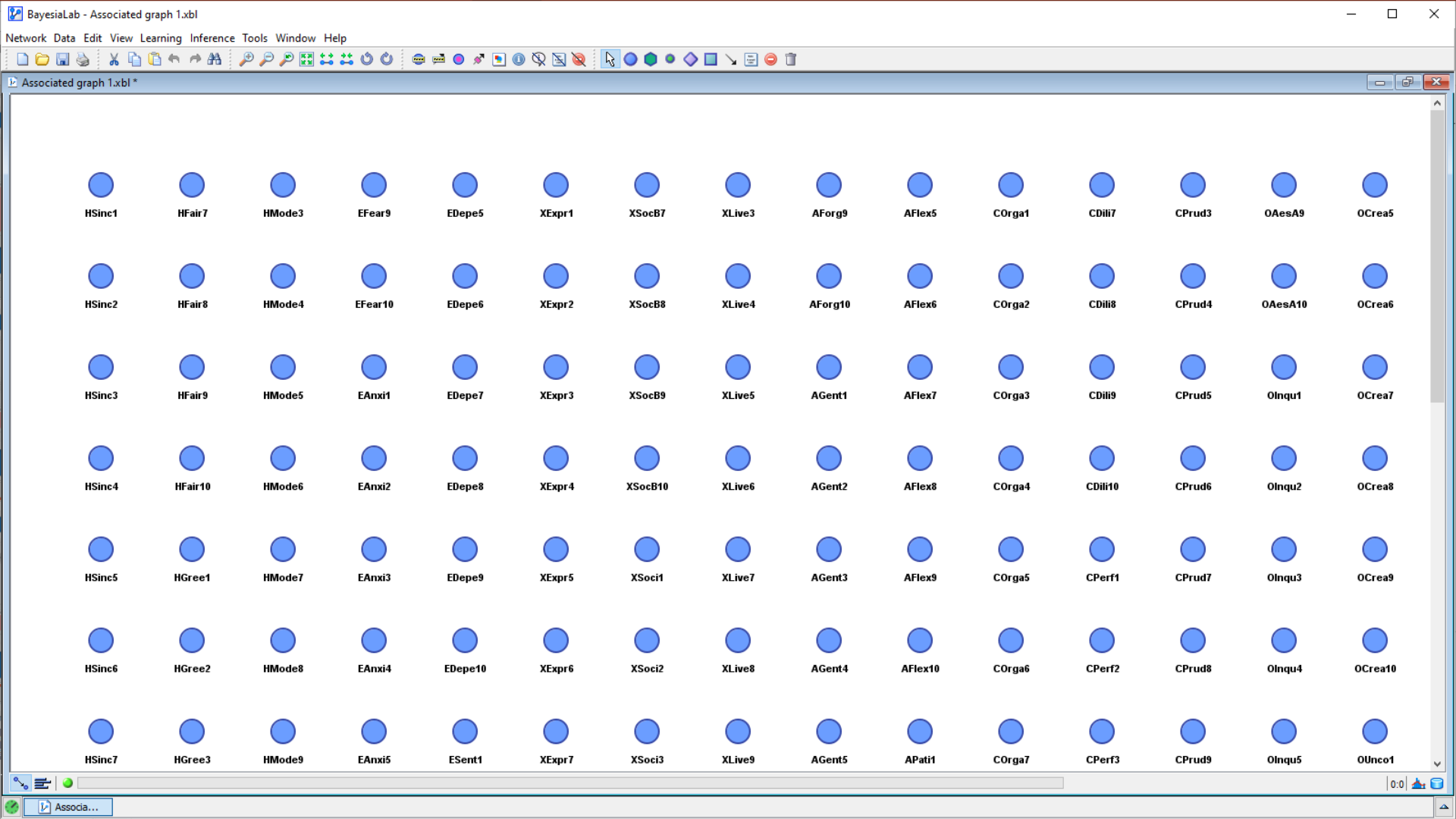
Data

HSinc1	HSinc2	HSinc3	HSinc4	HSinc5	HSinc6	HSinc7	HSinc8	HSinc9	HSinc10
2	3	5	3	2	3	3	6	3	2
4	4	5	5	4	6	6	6	4	3
6	2	3	3	2	5	2	5	5	6
1	5	6	5	7	7	6	7	7	7
6	4	5	4	5	5	4	5	5	4

Select All Continuous

Select All Discrete

Cancel Previous Next Save Finish



BayesiaLab - Associated graph 1.xbl

Network Data Edit View Learning Inference Tools Window Help

Open Data Source
Associate Data Source
Generate Data
Associate Dictionary
Export Dictionary
Evidence Scenario File
Database
Virtual Database
Charts Ctrl+Shift+G

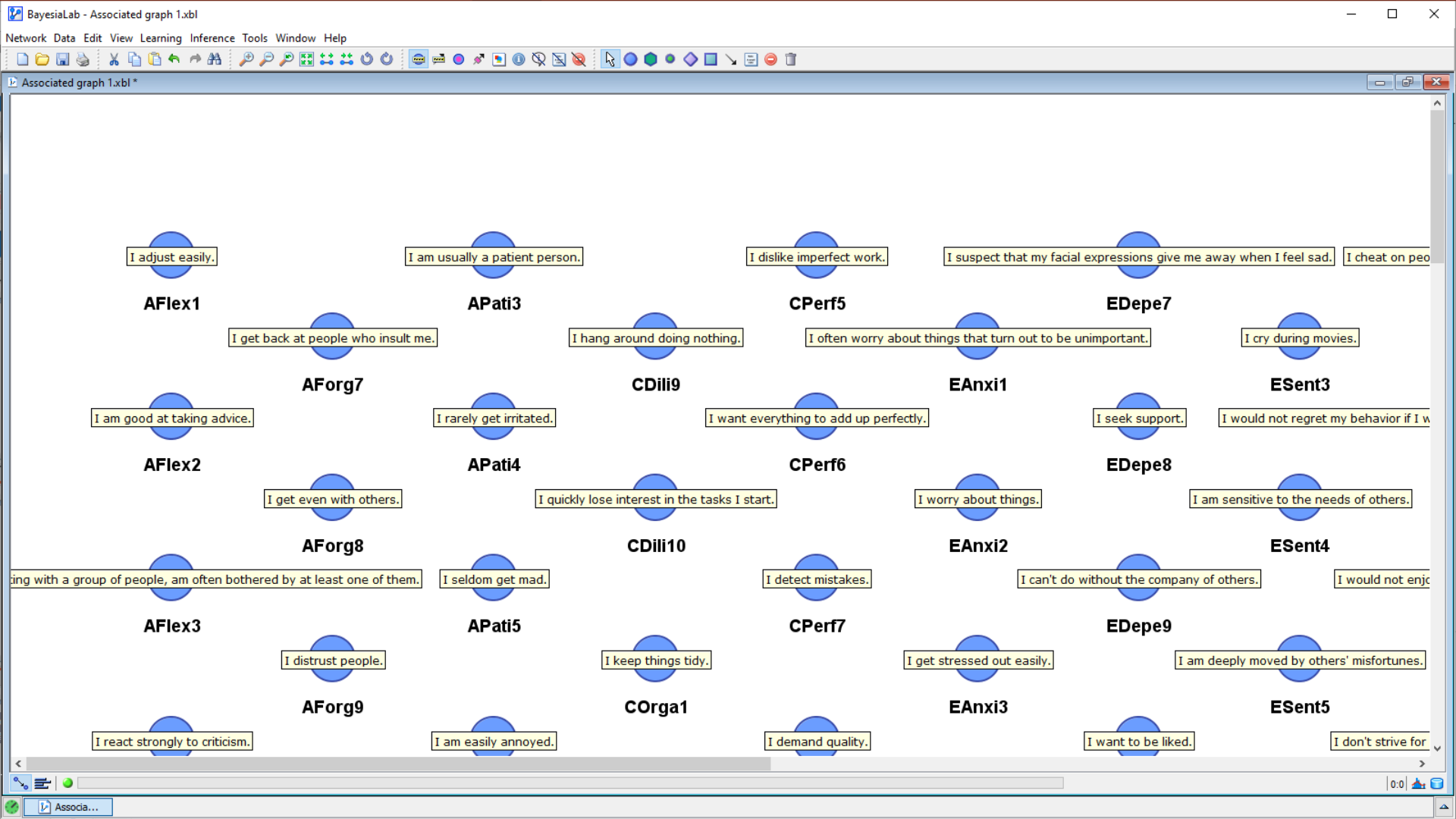
Arc
Node
State

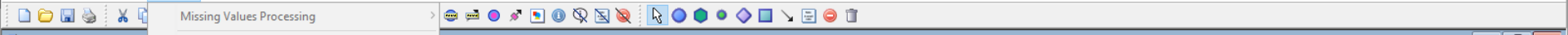
Node Renaming
Classes
Constants
Comments
Colors
Images
Costs
Temporal Indices
Local Structural Coefficients
State Virtual Numbers
Locations

HSinc2	HFair8	HMode4			XExpr1	XSocB7	XLive3	AForg9	AFlex5	COrga1	CDIli7	CPrud3	OAesA9	OCrea5
HSinc3	HFair9	HMode5	EAnxi1	EDepe7	XExpr2	XSocB8	XLive4	AForg10	AFlex6	COrga2	CDIli8	CPrud4	OAesA10	OCrea6
HSinc4	HFair10	HMode6	EAnxi2	EDepe8	XExpr3	XSocB9	XLive5	AGent1	AFlex7	COrga3	CDIli9	CPrud5	OlInqu1	OCrea7
HSinc5	HGree1	HMode7	EAnxi3	EDepe9	XExpr4	XSocB10	XLive6	AGent2	AFlex8	COrga4	CDIli10	CPrud6	OlInqu2	OCrea8
HSinc6	HGree2	HMode8	EAnxi4	EDepe10	XExpr5	XSoci1	XLive7	AGent3	AFlex9	COrga5	CPerf1	CPrud7	OlInqu3	OCrea9
HSinc7	HGree3	HMode9	EAnxi5	ESent1	XExpr6	XSoci2	XLive8	AGent4	AFlex10	COrga6	CPerf2	CPrud8	OlInqu4	OCrea10
					XExpr7	XSoci3	XLive9	AGent5	APati1	COrga7	CPerf3	CPrud9	OlInqu5	OUnco1

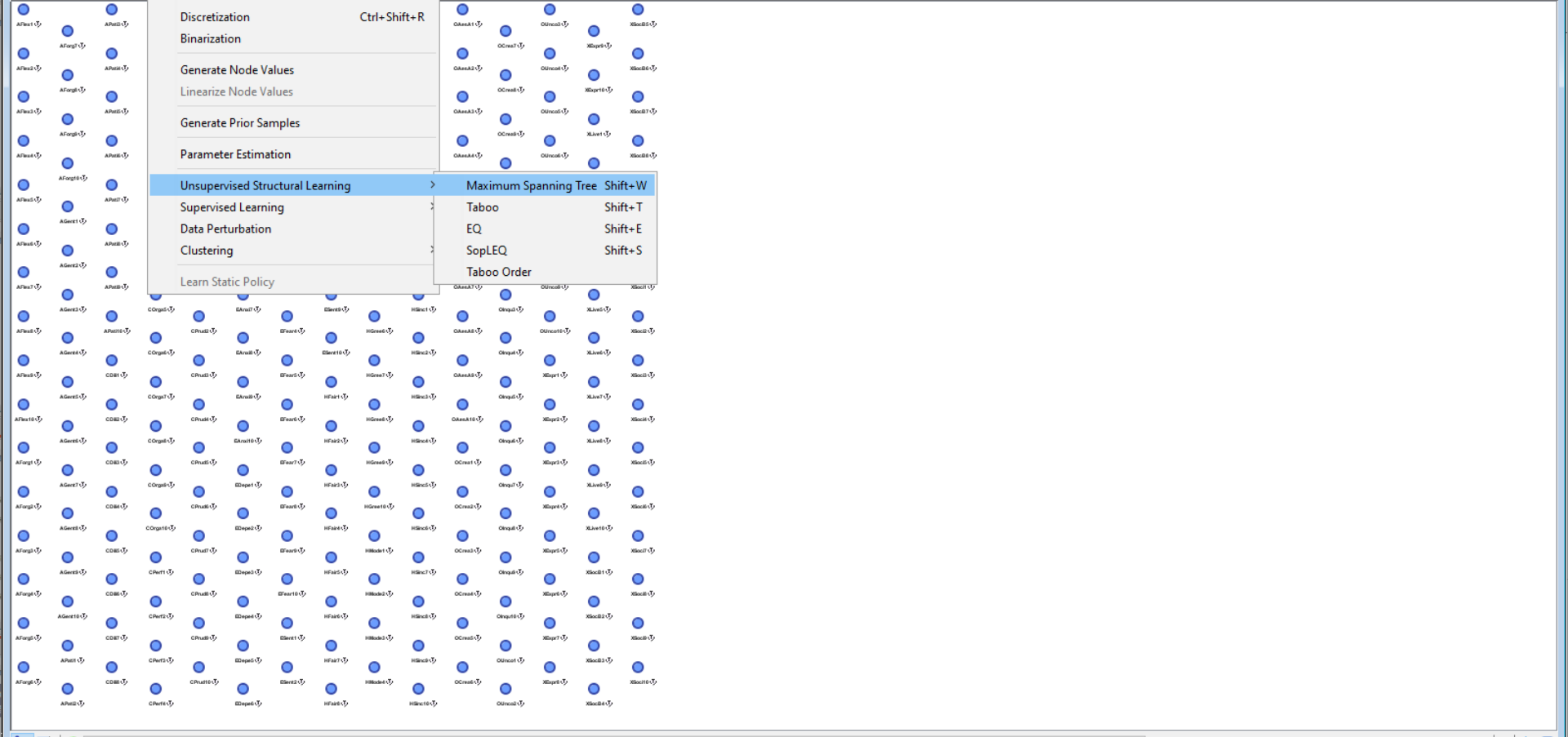
Associa...

0:0





Associated graph 1.xbl



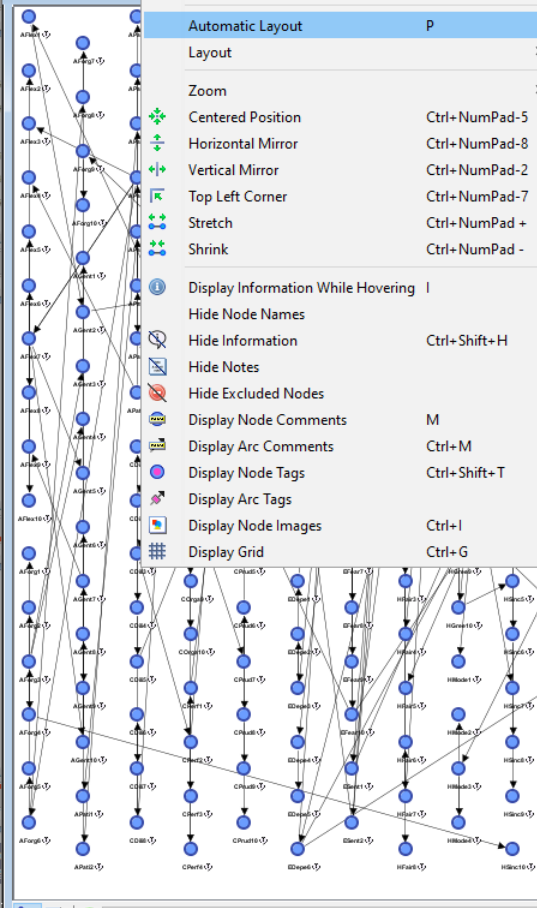
- Missing Values Processing
- Stratification
- Discretization Ctrl+Shift+R
- Binarization
- Generate Node Values
- Linearize Node Values
- Generate Prior Samples
- Parameter Estimation
- Unsupervised Structural Learning**
- Supervised Learning
- Data Perturbation
- Clustering
- Learn Static Policy

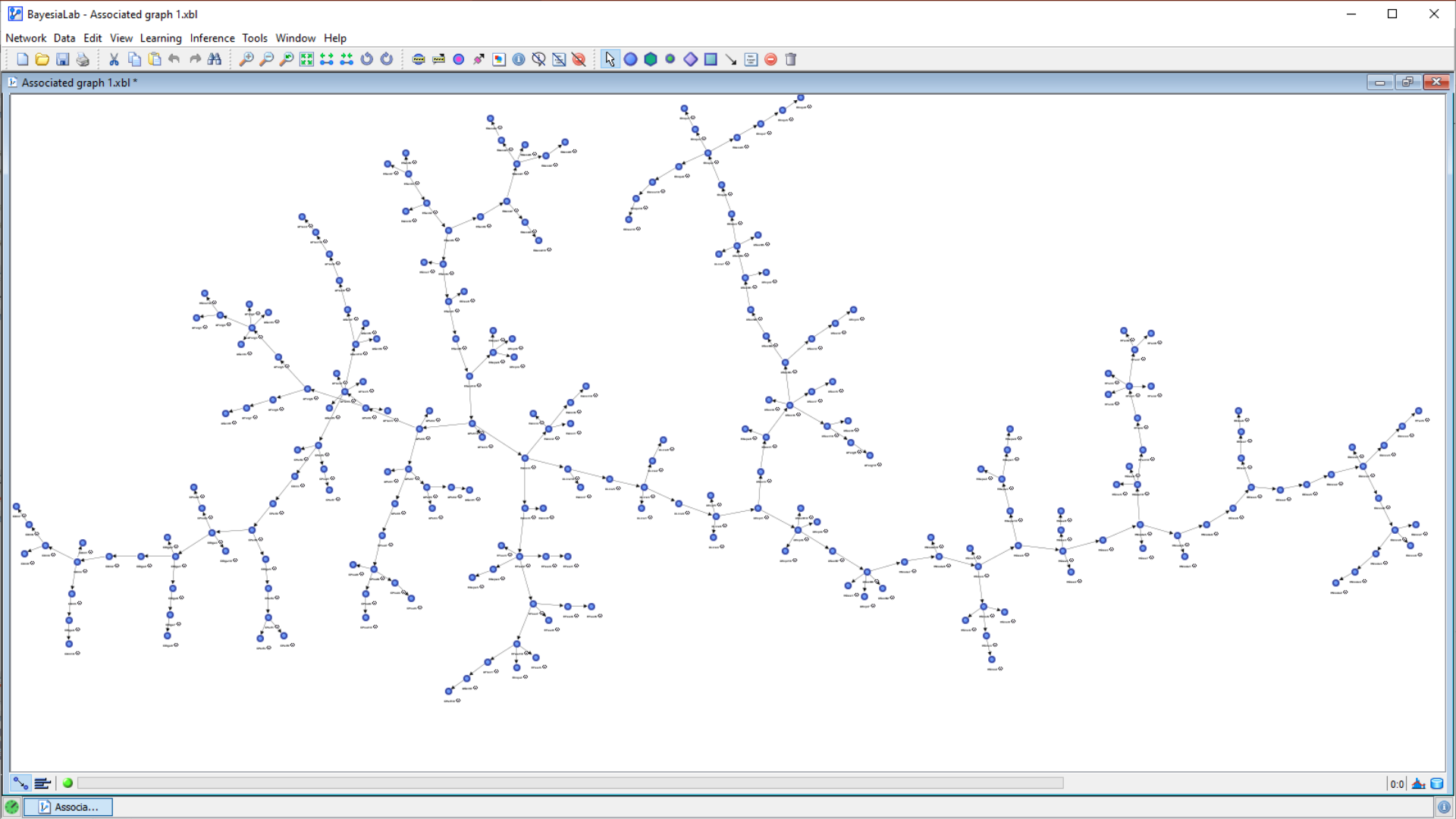
- Maximum Spanning Tree** Shift+W
- Taboo Shift+T
- EQ Shift+E
- SopLEQ Shift+S
- Taboo Order

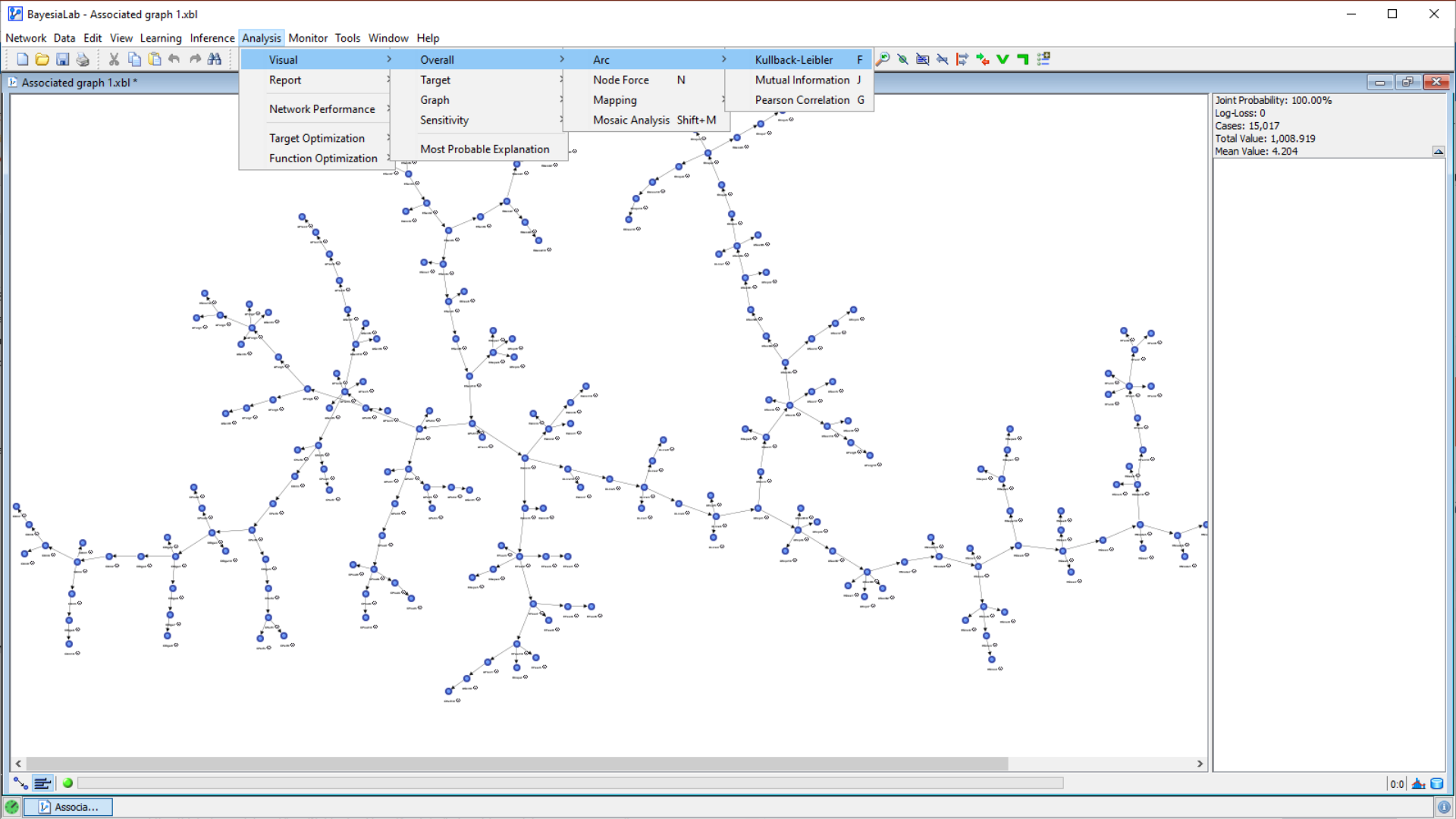
Modeling Mode F4
 Validation Mode F5

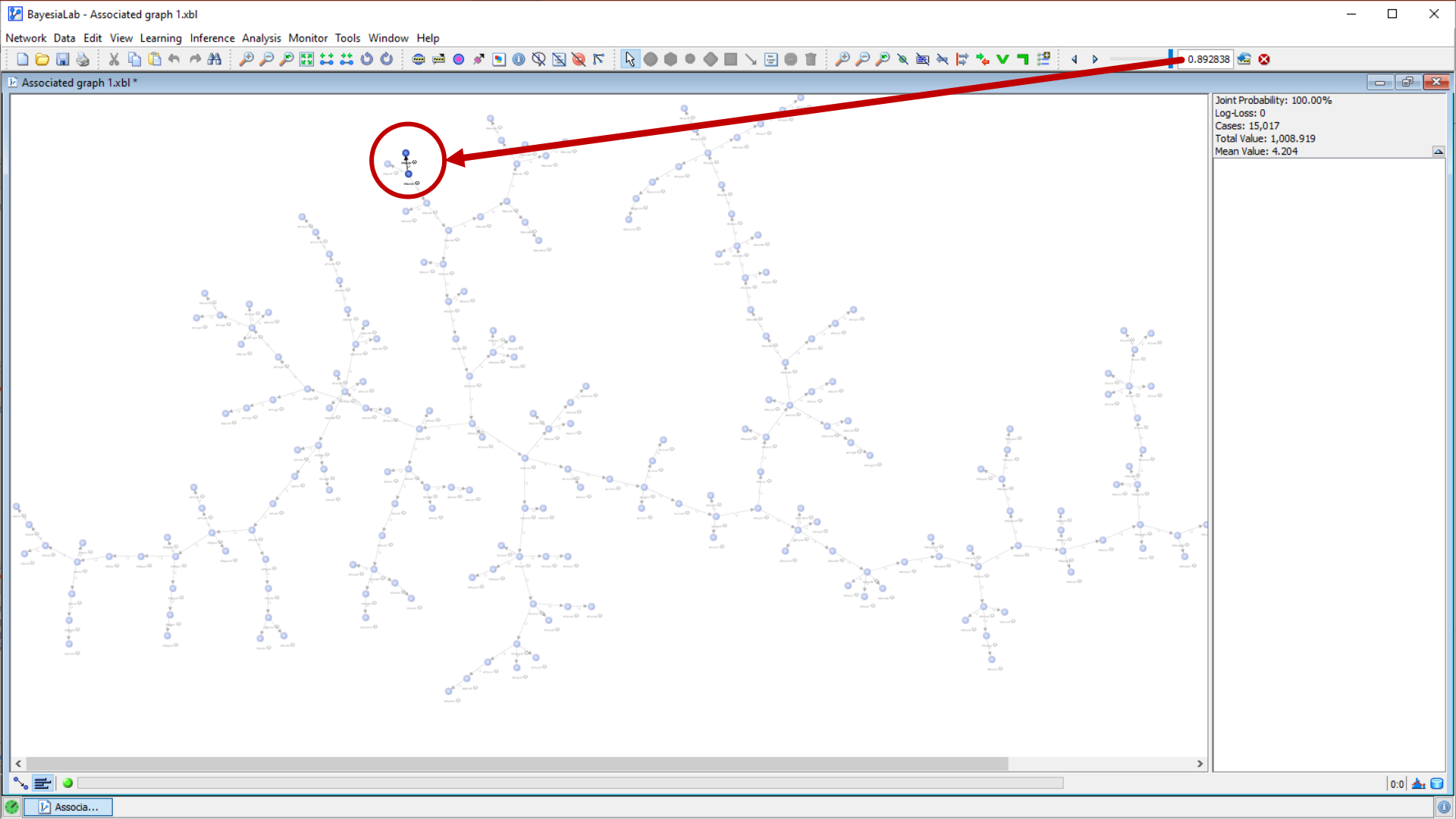
Associated graph

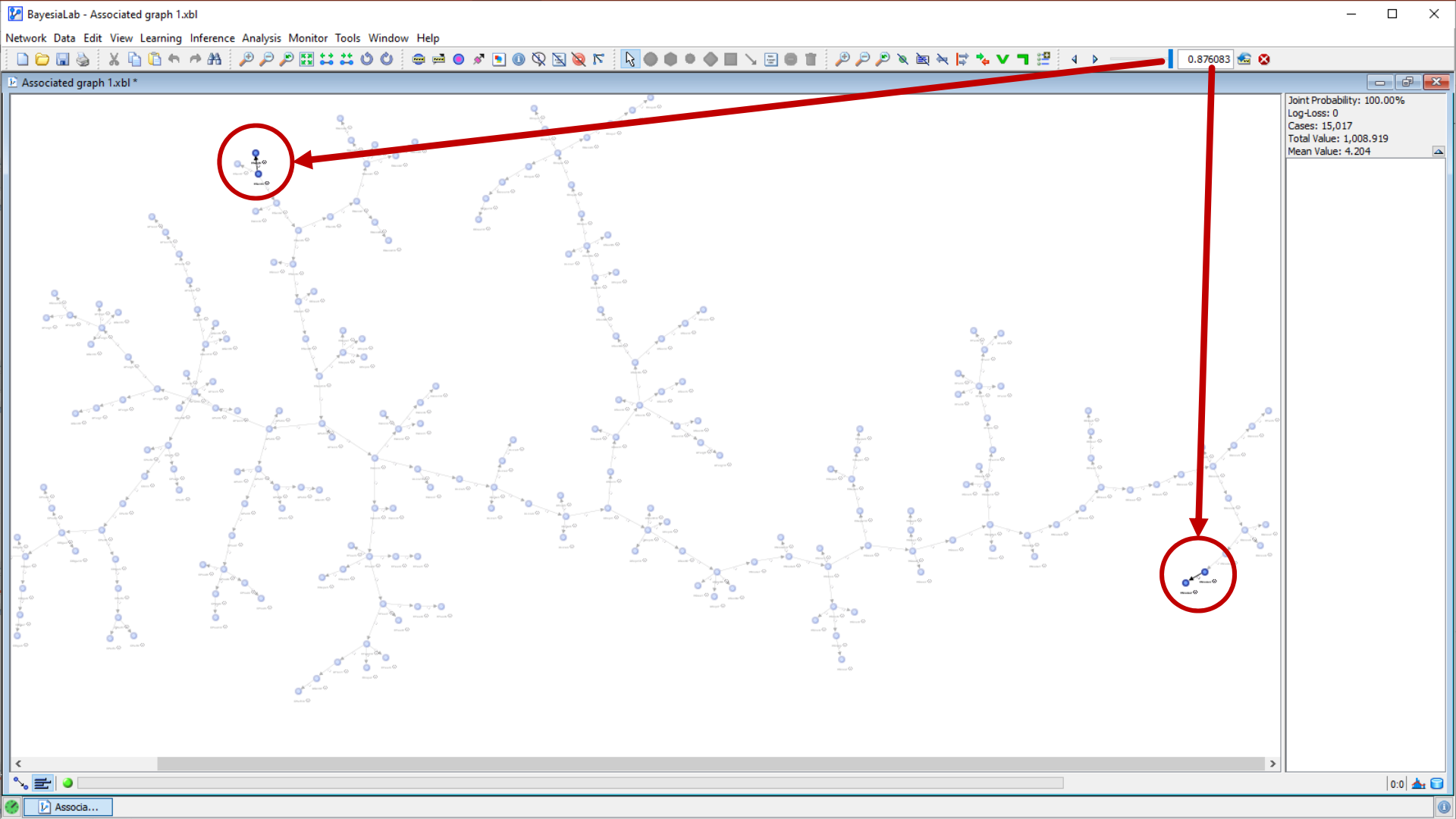
- Automatic Layout P
- Layout >
- Zoom >
- Centered Position Ctrl+NumPad-5
- Horizontal Mirror Ctrl+NumPad-8
- Vertical Mirror Ctrl+NumPad-2
- Top Left Corner Ctrl+NumPad-7
- Stretch Ctrl+NumPad +
- Shrink Ctrl+NumPad -
- Display Information While Hovering I
- Hide Node Names
- Hide Information Ctrl+Shift+H
- Hide Notes
- Hide Excluded Nodes
- Display Node Comments M
- Display Arc Comments Ctrl+M
- Display Node Tags Ctrl+Shift+T
- Display Arc Tags
- Display Node Images Ctrl+I
- Display Grid Ctrl+G

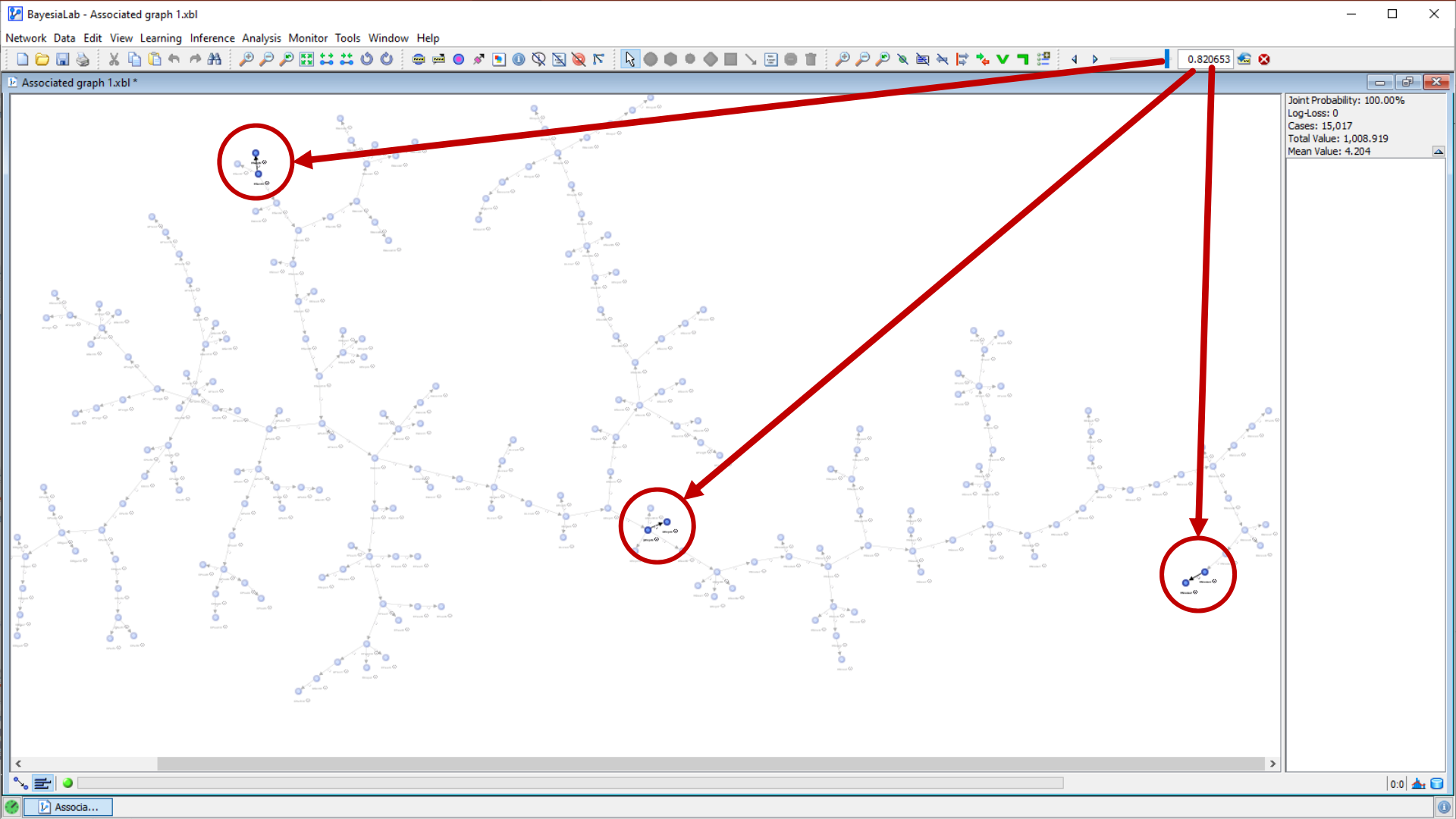


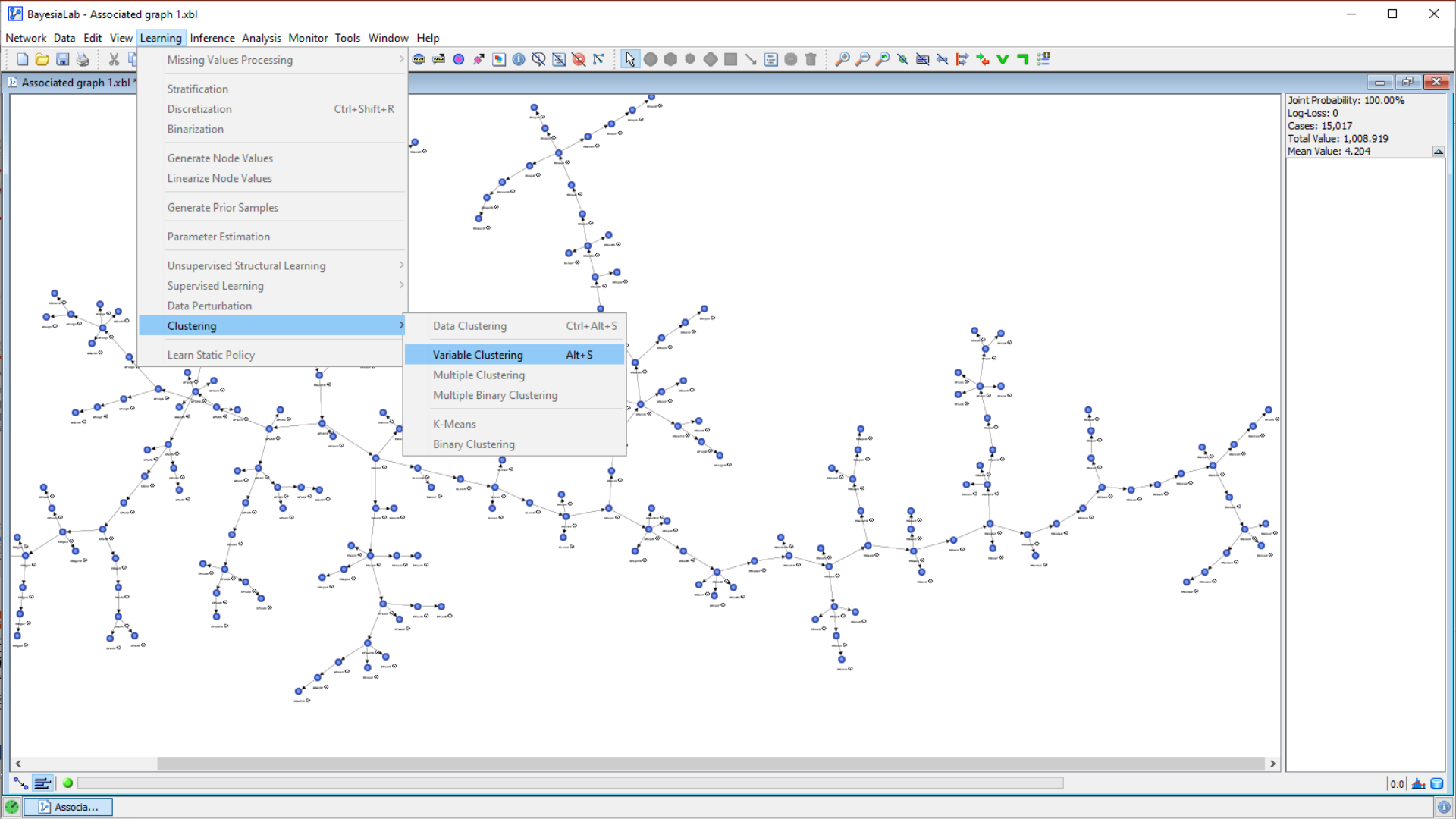












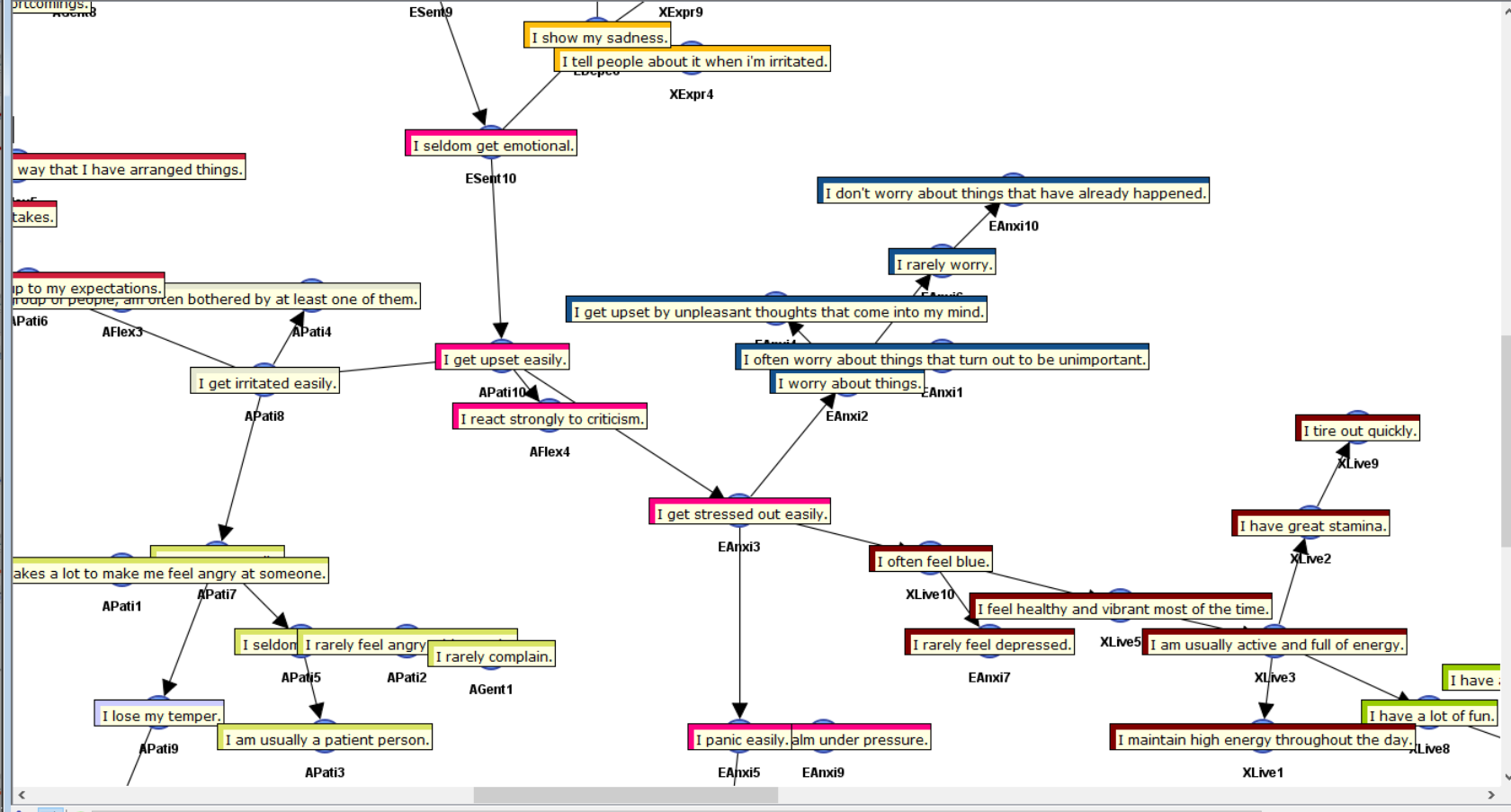
- Missing Values Processing
- Stratification
- Discretization Ctrl+Shift+R
- Binarization
- Generate Node Values
- Linearize Node Values
- Generate Prior Samples
- Parameter Estimation
- Unsupervised Structural Learning
- Supervised Learning
- Data Perturbation
- Clustering**
- Learn Static Policy

- Data Clustering Ctrl+Alt+S
- Variable Clustering** Alt+S
- Multiple Clustering
- Multiple Binary Clustering
- K-Means
- Binary Clustering

Joint Probability: 100.00%
Log-Loss: 0
Cases: 15,017
Total Value: 1,008.919
Mean Value: 4.204



Associated graph 1.xbl *



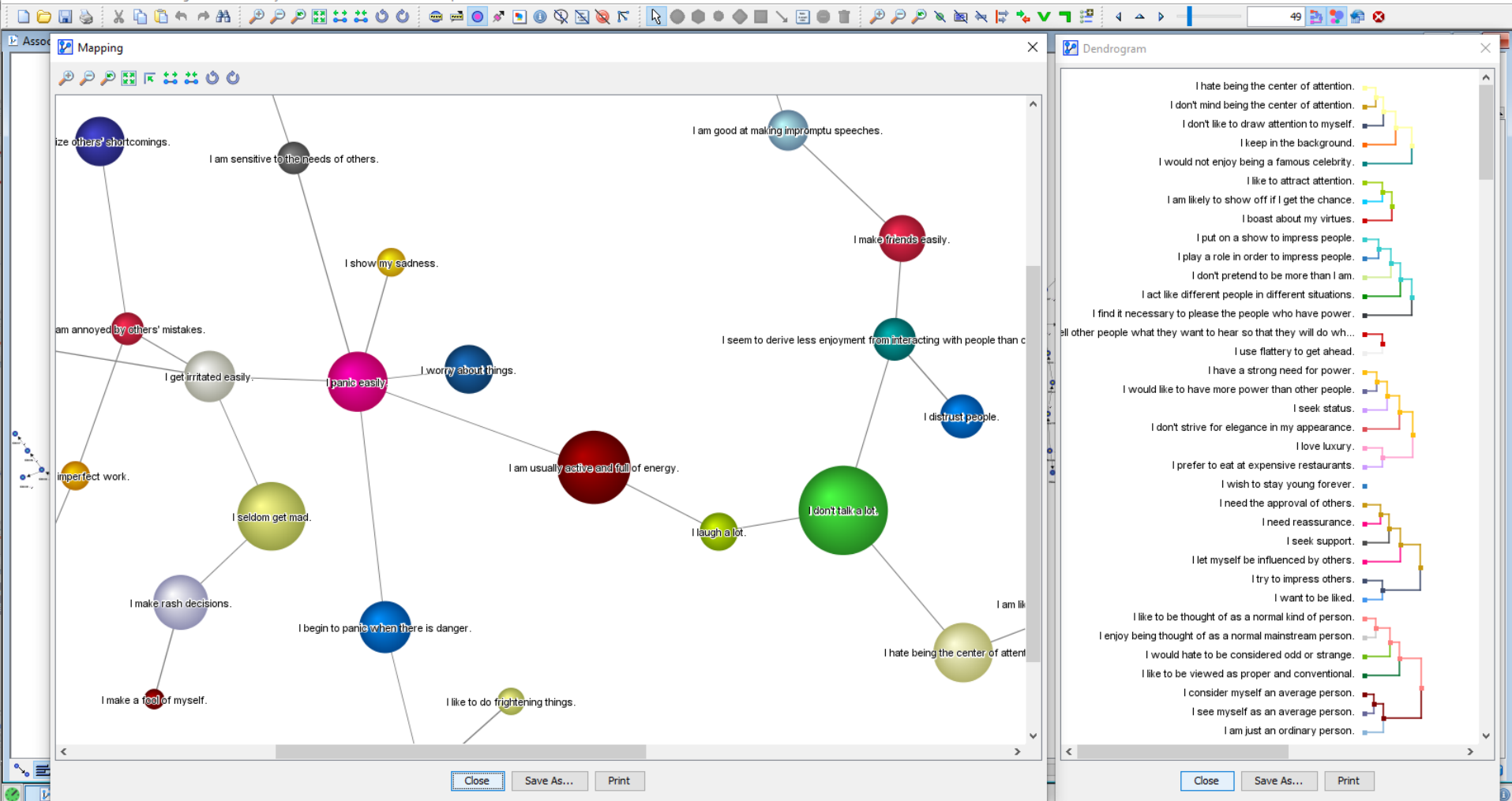
Joint Probability: 100.00%

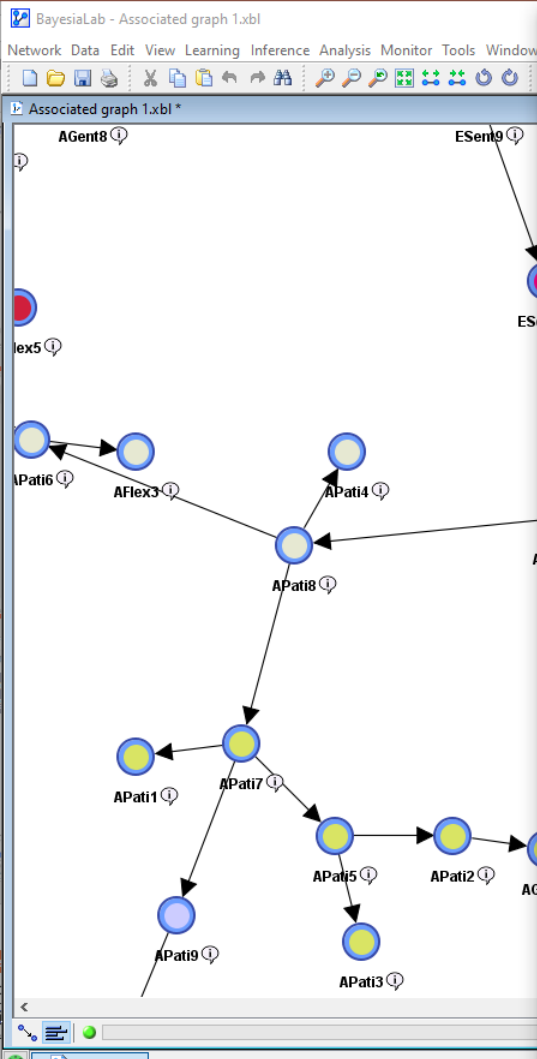
Log-Loss: 0

Cases: 15,017

Total Value: 1,008.919

Mean Value: 4.204

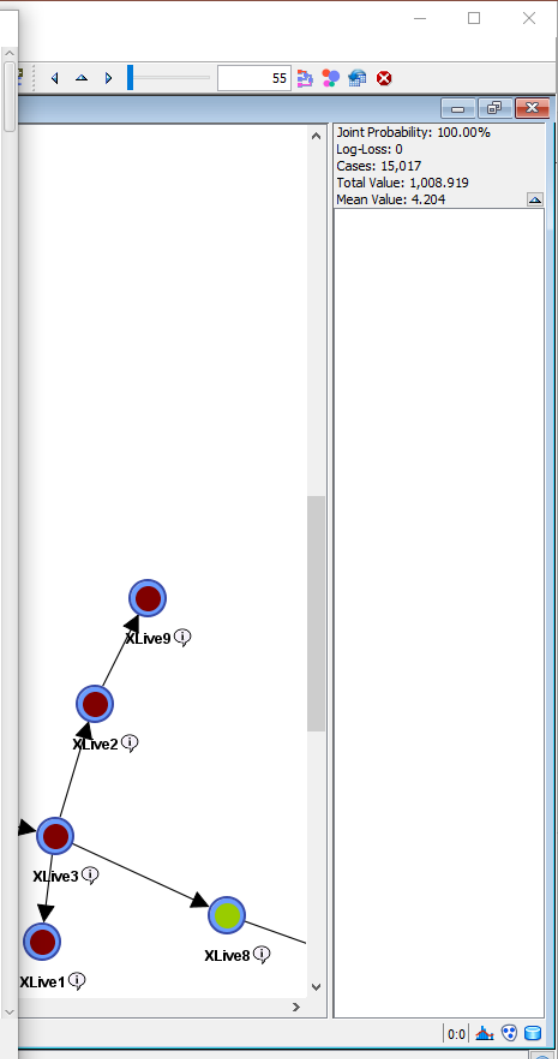


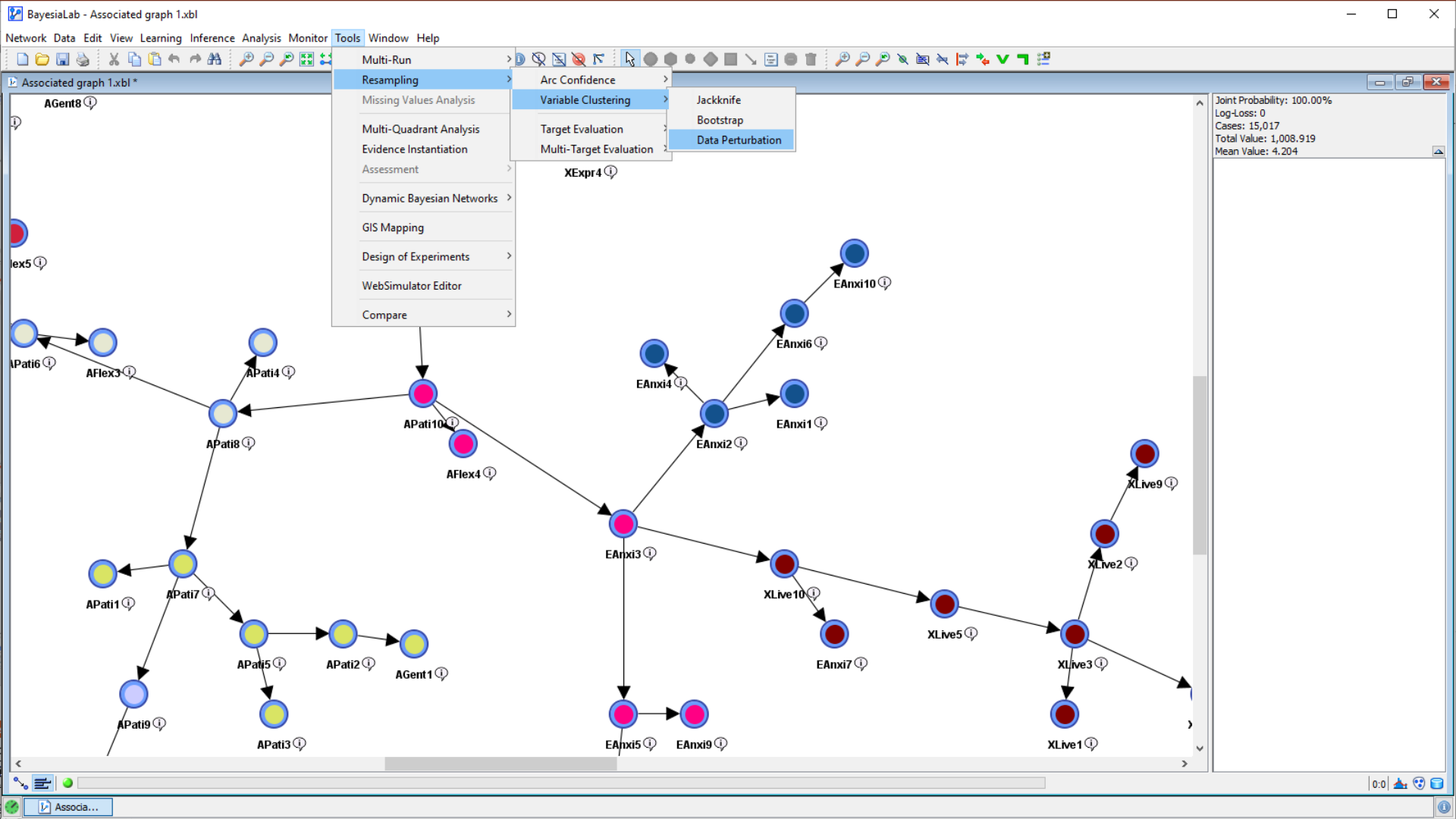


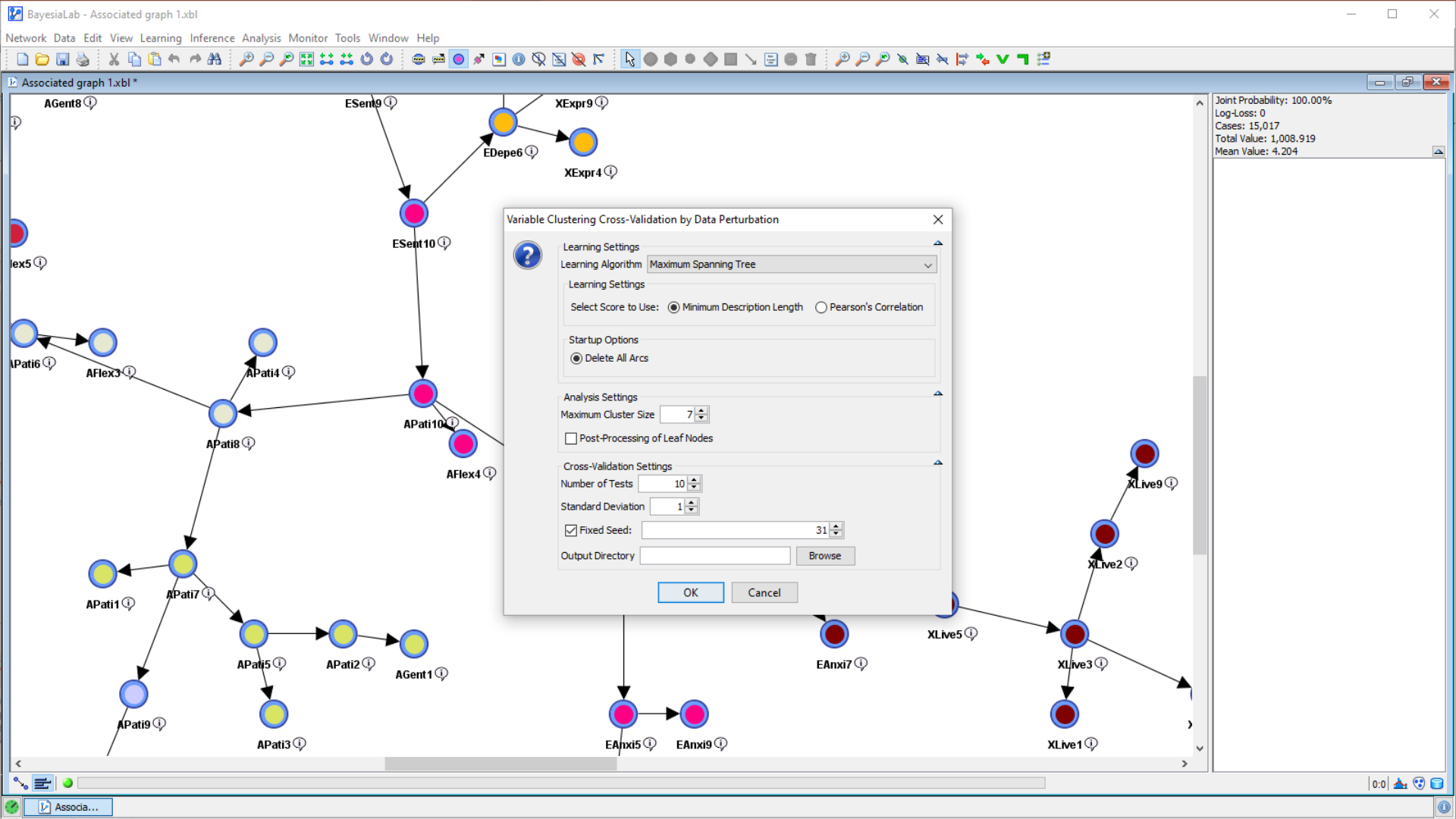
Variable Clustering Report (Associated graph 1) [2]

Classes	Nodes	Comments
[Factor_0]	ESent3	I cry during movies.
	ESent6	I rarely cry during sad movies.
	ESent2	I immediately feel sad when hearing of an unhappy event.
	ESent5	I am deeply moved by others' misfortunes.
	ESent7	I seldom feel weepy while reading the sad part of a story.
	ESent8	I am seldom bothered by the apparent suffering of strangers.
[Factor_1]	EAnxi8	I am not easily disturbed by events.
	XSocB1	I am good at making impromptu speeches.
	XSocB4	I have leadership abilities.
	XSocB6	I would be afraid to give a speech in public.
	XSocB5	I have a strong personality.
	XExpr2	I am never at a loss for words.
[Factor_2]	XLive7	I feel that I have a lot of inner strength.
	EAnxi5	I panic easily.
	APati10	I get upset easily.
	EAnxi3	I get stressed out easily.
	EAnxi9	I remain calm under pressure.
	ESent10	I seldom get emotional.
[Factor_3]	ESent9	I don't understand people who get emotional.
	AFlex4	I react strongly to criticism.
	HMode4	I consider myself an average person.
	QUnco9	I like to be thought of as a normal kind of person.
	HMode3	I am just an ordinary person.
	HMode2	I see myself as an average person.
[Factor_4]	QUnco7	I enjoy being thought of as a normal mainstream person.
	QUnco6	I would hate to be considered odd or strange.
	QUnco8	I like to be viewed as proper and conventional.
	EFear2	I begin to panic when there is danger.
	EFear4	I tremble in dangerous situations.
	EDepe4	I need protection.
[Factor_5]	EFear1	I am a physical coward.
	EDepe5	I often need help.
	EFear3	I would fear walking in a high-crime part of a city.
	APati5	I seldom get mad.
	APati7	I get angry easily.
[Factor_5]	APati2	I rarely feel angry with people.
	APati1	I find that it takes a lot to make me feel angry at someone.

Close Save As... Print







BayesiaLab - Associated graph

Network Data Edit View Lea

Associated graph 1.xbl *

AGent8

lex5

IPat6

AFlex3

APat1

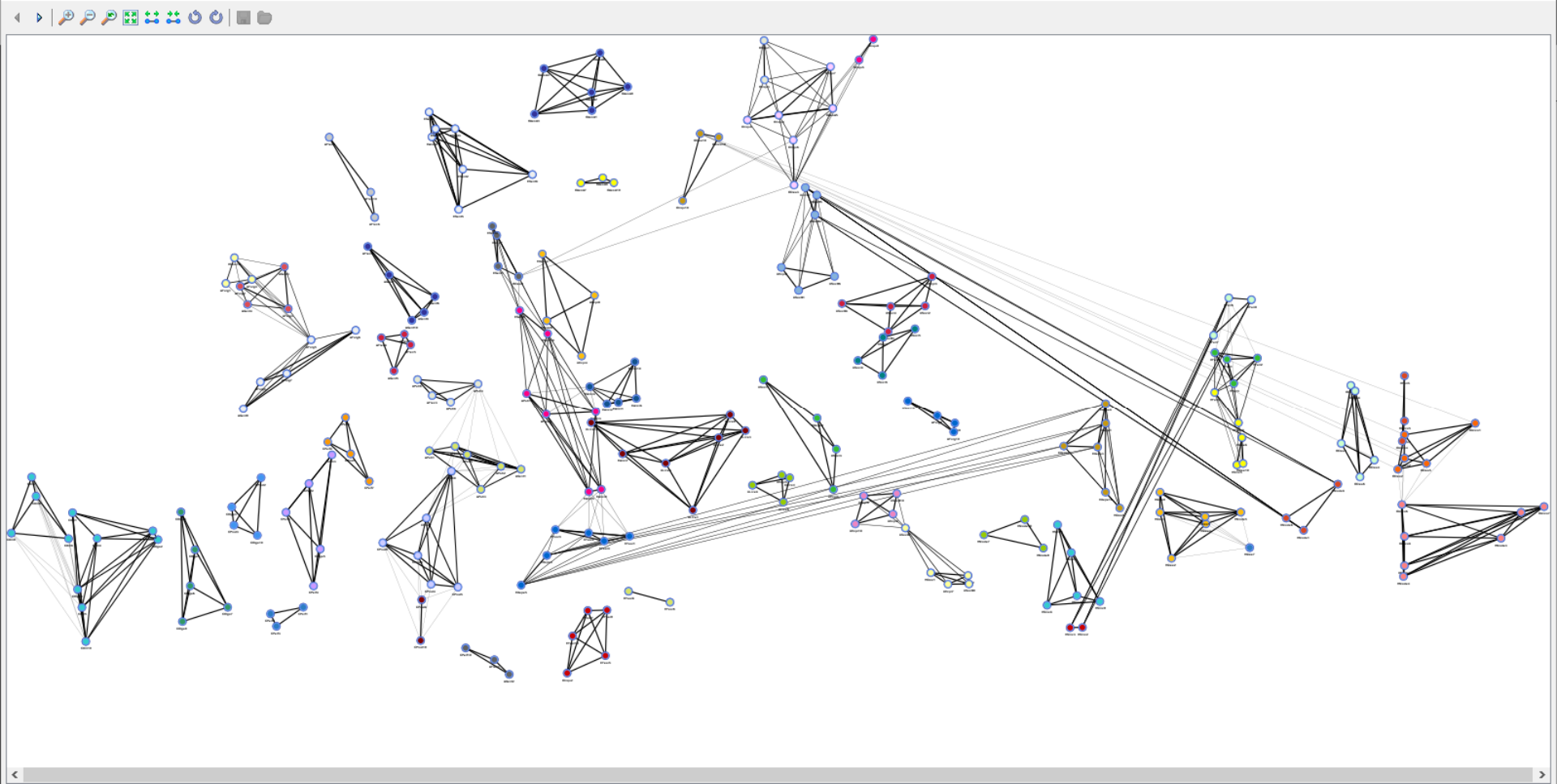
APat9

Variable Clustering Report

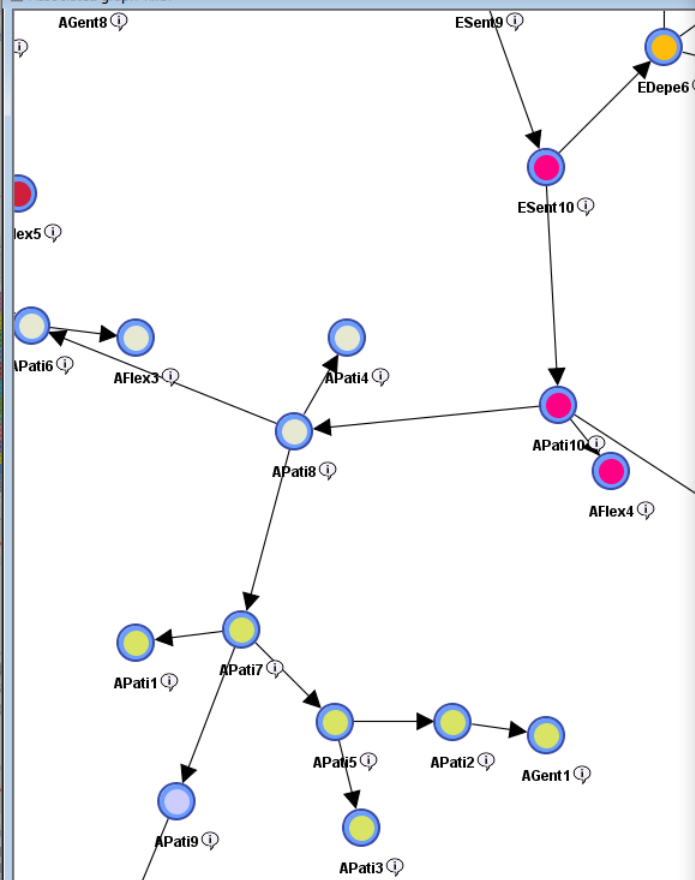
I have little to say.

	[Factor_40]	[Factor_20]	[Factor_39]	[Factor_40]	[Factor_39]	[Factor_20]	[Factor_40]	[Factor_22]	[Factor_21]	[Factor_40]	[Factor_40]
AForq1 I love my enemies.	[Factor_41]	[Factor_42]	[Factor_48]	[Factor_42]	[Factor_47]	[Factor_41]	[Factor_41]	[Factor_42]	[Factor_47]	[Factor_41]	[Factor_41]
AForq4 I am nice to people I should be angry at.	[Factor_41]	[Factor_42]	[Factor_3]	[Factor_42]	[Factor_3]	[Factor_41]	[Factor_41]	[Factor_42]	[Factor_3]	[Factor_41]	[Factor_41]
HSinc10 I let people push me around to help them feel important.	[Factor_41]	[Factor_42]	[Factor_3]	[Factor_42]	[Factor_3]	[Factor_41]	[Factor_41]	[Factor_42]	[Factor_3]	[Factor_41]	[Factor_41]
HFair6 I admire a really clever scam.	[Factor_42]	[Factor_43]	[Factor_17]	[Factor_43]	[Factor_41]	[Factor_11]	[Factor_14]	[Factor_15]	[Factor_14]	[Factor_15]	[Factor_13]
HFair7 I cheat to get ahead.	[Factor_42]	[Factor_43]	[Factor_17]	[Factor_43]	[Factor_41]	[Factor_26]	[Factor_14]	[Factor_15]	[Factor_14]	[Factor_15]	[Factor_13]
HFair9 I cheat on people who have trusted me.	[Factor_42]	[Factor_43]	[Factor_17]	[Factor_43]	[Factor_41]	[Factor_26]	[Factor_14]	[Factor_15]	[Factor_14]	[Factor_15]	[Factor_13]
AFlex1 I adjust easily.	[Factor_43]	[Factor_44]	[Factor_41]	[Factor_44]	[Factor_42]	[Factor_42]	[Factor_42]	[Factor_43]	[Factor_42]	[Factor_42]	[Factor_42]
AGent2 I take things as they come.	[Factor_43]	[Factor_44]	[Factor_41]	[Factor_44]	[Factor_42]	[Factor_42]	[Factor_42]	[Factor_43]	[Factor_42]	[Factor_42]	[Factor_42]
CPerf10 I prefer to just let things happen.	[Factor_43]	[Factor_44]	[Factor_41]	[Factor_44]	[Factor_42]	[Factor_42]	[Factor_42]	[Factor_43]	[Factor_42]	[Factor_42]	[Factor_42]
OAsA7 I seldom notice the emotional aspects of paintings and pictures.	[Factor_44]	[Factor_45]	[Factor_42]	[Factor_45]	[Factor_43]	[Factor_43]	[Factor_43]	[Factor_44]	[Factor_41]	[Factor_43]	[Factor_43]
OAsA8 I do not like poetry.	[Factor_44]	[Factor_45]	[Factor_42]	[Factor_45]	[Factor_43]	[Factor_43]	[Factor_43]	[Factor_44]	[Factor_41]	[Factor_43]	[Factor_43]
OAsA10 I do not enjoy watching dance performances.	[Factor_44]	[Factor_45]	[Factor_42]	[Factor_45]	[Factor_43]	[Factor_43]	[Factor_43]	[Factor_44]	[Factor_41]	[Factor_43]	[Factor_43]
HMode1 I don't think that I'm better than other people.	[Factor_45]	[Factor_7]	[Factor_45]	[Factor_9]	[Factor_10]	[Factor_9]	[Factor_8]	[Factor_46]	[Factor_9]	[Factor_45]	[Factor_46]
HMode6 I believe that I am better than others.	[Factor_45]	[Factor_7]	[Factor_45]	[Factor_9]	[Factor_10]	[Factor_9]	[Factor_8]	[Factor_46]	[Factor_9]	[Factor_45]	[Factor_46]
HMode8 I am more capable than most others.	[Factor_45]	[Factor_7]	[Factor_45]	[Factor_9]	[Factor_10]	[Factor_9]	[Factor_8]	[Factor_46]	[Factor_9]	[Factor_45]	[Factor_46]
HMode7 I like to attract attention.	[Factor_46]	[Factor_47]	[Factor_44]	[Factor_47]	[Factor_45]	[Factor_46]	[Factor_46]	[Factor_47]	[Factor_45]	[Factor_46]	[Factor_45]
HMode9 I am likely to show off if I get the chance.	[Factor_46]	[Factor_47]	[Factor_44]	[Factor_47]	[Factor_45]	[Factor_46]	[Factor_46]	[Factor_47]	[Factor_45]	[Factor_46]	[Factor_45]
HMode10 I boast about my virtues.	[Factor_46]	[Factor_47]	[Factor_44]	[Factor_47]	[Factor_45]	[Factor_46]	[Factor_46]	[Factor_47]	[Factor_45]	[Factor_46]	[Factor_45]
HFair5 I try to follow the rules.	[Factor_47]	[Factor_48]	[Factor_46]	[Factor_48]	[Factor_46]	[Factor_47]	[Factor_48]	[Factor_48]	[Factor_46]	[Factor_47]	[Factor_47]
QUnc04 I rebel against authority.	[Factor_47]	[Factor_48]	[Factor_46]	[Factor_48]	[Factor_46]	[Factor_48]	[Factor_47]	[Factor_48]	[Factor_46]	[Factor_47]	[Factor_47]
QUnc05 I swim against the current.	[Factor_47]	[Factor_48]	[Factor_46]	[Factor_48]	[Factor_46]	[Factor_48]	[Factor_47]	[Factor_48]	[Factor_46]	[Factor_47]	[Factor_47]
QInqu1 I am interested in science.	[Factor_48]	[Factor_11]	[Factor_14]	[Factor_12]	[Factor_48]	[Factor_12]	[Factor_48]	[Factor_13]	[Factor_48]	[Factor_48]	[Factor_48]
QInqu3 I enjoy intellectual games.	[Factor_48]	[Factor_11]	[Factor_14]	[Factor_12]	[Factor_48]	[Factor_12]	[Factor_48]	[Factor_13]	[Factor_48]	[Factor_48]	[Factor_48]
CPerf1 I pay attention to details.	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]
CPerf3 I have an eye for detail.	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]
CPerf9 I pay too little attention to details.	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]	[Factor_49]
CPrud8 I make careless mistakes.	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_51]	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_8]
CPrud10 I make a fool of myself.	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_51]	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_50]	[Factor_8]
HSinc2 I use flattery to get ahead.	[Factor_51]	[Factor_52]	[Factor_17]	[Factor_51]	[Factor_51]	[Factor_26]	[Factor_14]	[Factor_15]	[Factor_14]	[Factor_15]	[Factor_13]
HSinc3 I tell other people what they want to hear so that they will do what I want them to do.	[Factor_51]	[Factor_52]	[Factor_17]	[Factor_51]	[Factor_51]	[Factor_26]	[Factor_14]	[Factor_15]	[Factor_14]	[Factor_15]	[Factor_13]
QInqu5 I find political discussions interesting.	[Factor_52]	[Factor_22]	[Factor_52]	[Factor_23]	[Factor_52]	[Factor_53]	[Factor_52]	[Factor_24]	[Factor_52]	[Factor_51]	[Factor_52]
QInqu9 I don't bother worrying about political and social problems.	[Factor_52]	[Factor_22]	[Factor_52]	[Factor_23]	[Factor_52]	[Factor_53]	[Factor_52]	[Factor_24]	[Factor_52]	[Factor_51]	[Factor_52]
EFear6 I like to do frightening things.	[Factor_53]	[Factor_53]	[Factor_53]	[Factor_52]	[Factor_53]	[Factor_54]	[Factor_53]	[Factor_51]	[Factor_53]	[Factor_52]	[Factor_53]
EFear8 I love dangerous situations.	[Factor_53]	[Factor_53]	[Factor_53]	[Factor_52]	[Factor_53]	[Factor_54]	[Factor_53]	[Factor_51]	[Factor_53]	[Factor_52]	[Factor_53]
HGree7 I wish to stay young forever.	[Factor_54]	[Factor_54]	[Factor_54]	[Factor_53]	[Factor_54]	[Factor_0]	[Factor_54]	[Factor_52]	[Factor_54]	[Factor_53]	[Factor_54]
Fit Score		94.5946%	91.0811%	95.6888%	95.4054%	90.2453%	94.5946%	94.6293%	92.7027%	97.3060%	94.5946%

Close Save As... Print Clustering Frequency Graph



Associated graph 1.xbl *



Multiple Clustering



Output

Output Directory ...\..\Studies\HEXACO\MC7

Browse

- Add all Nodes to the Final Network
- Connect Factors to their Manifest Variables
- Forbid new Relationships with Manifest Variables
- Compute Manifests' Contributions to their Factor
- Display Intermediate Reports
- Create Cluster with Ordered Numerical States

Clustering Settings

- Fixed Number of States
- Average Number of Variables' States
- Automatic Selection of the Number of States
 - Initial Number of States
 - Maximum Number of States
 - Minimum Cluster Purity (%)
 - Minimal Cluster Size (%)

Options

- Sample Size (%) Number of Rows
- Number of Steps
- Meta-Clustering Used Clusters (%)
- Multinet
- Look Weight:
- Behavior Weight:
- Fixed Seed:

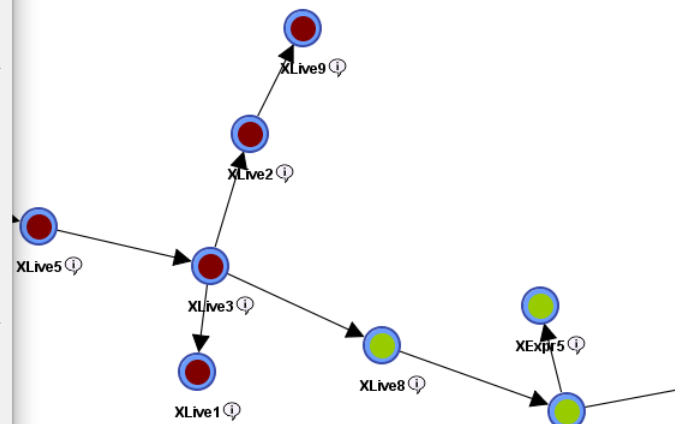
Node Weights

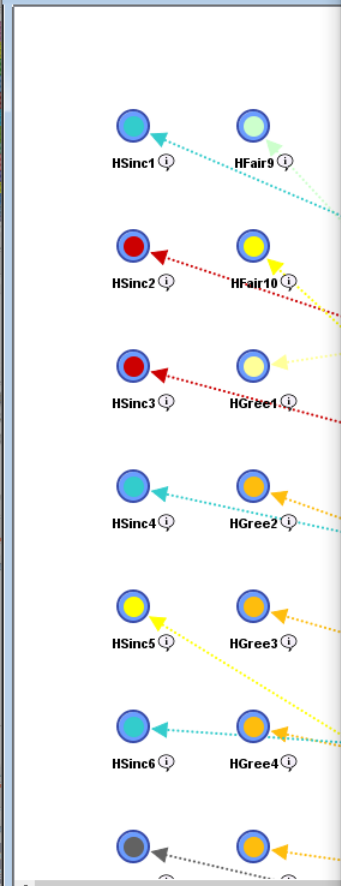
- Random Weights

Edit Node Weights

OK

Cancel





Multiple Clustering on Network Associated graph 1 (Associated graph_1_Final)

Automatic Selection of the Number of States by Random Walk

Number of Steps	10
Sample Size	100.0000%
Initial Number of States	2
Maximum Number of States	7
Minimum Cluster Purity	70.0000%
Minimal Cluster Size	1.0000%
Random Number Generator's Seed	31

Result Summary

Statistics	Min	Mean	Max
Number of Factors			54
Number of Clusters	2	4.9444	7
Mean Purity	80.2359%	85.6986%	93.4544%
Contingency Table Fit	33.2139%	67.1222%	94.9874%
Hypercube Cells Per State	10.0527	6,384.9394	54,910.6286

[Factor_0] - I cry during movies._(7)

Performance Indices

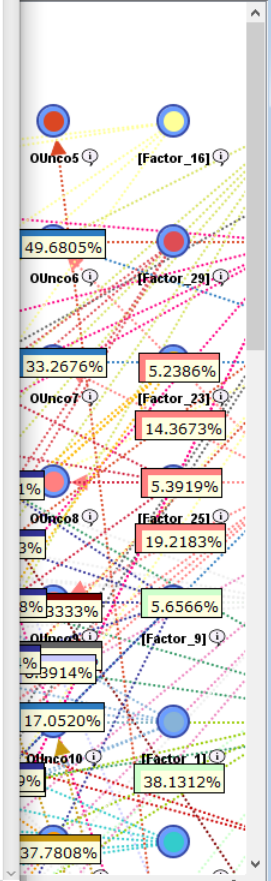
Mean Purity	86.3660%
Contingency Table Fit	39.0043%
Deviance	73,912.8418
Hypercube Cells Per State	45,888.1135

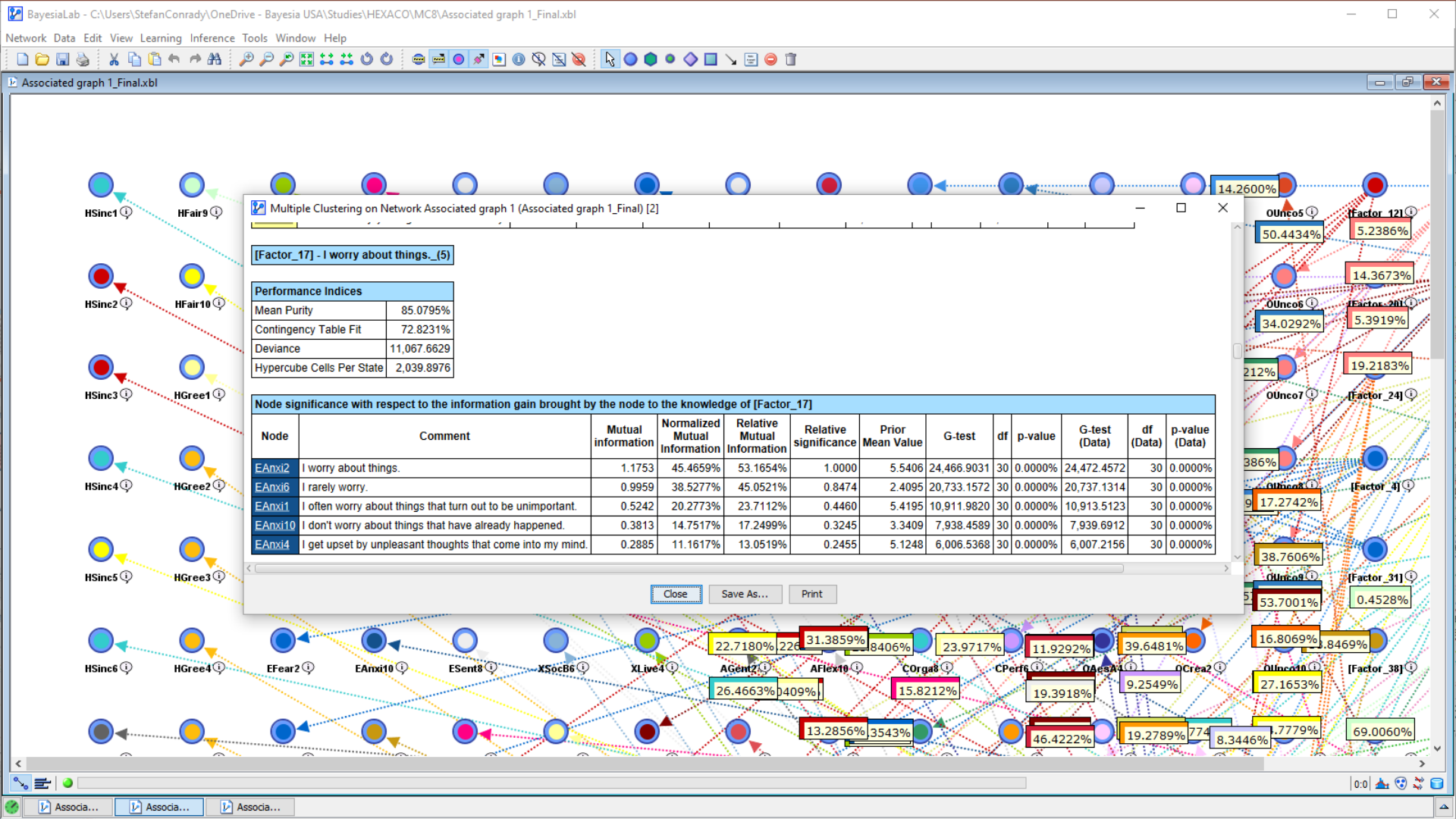
Node significance with respect to the information gain brought by the node to the knowledge of [Factor_0]

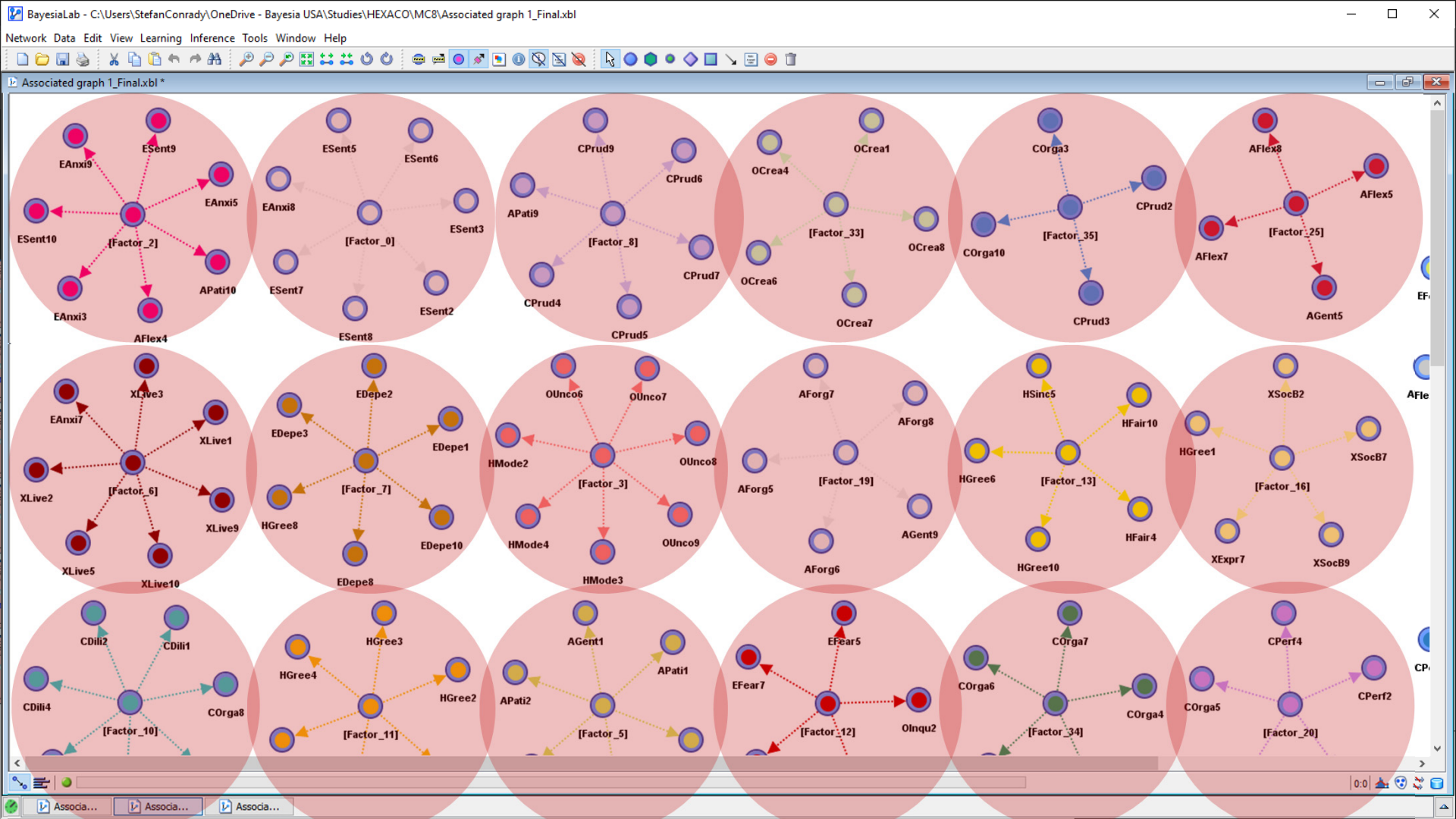
Node	Comment	Mutual information	Normalized Mutual Information	Relative Mutual Information	Relative significance	Prior Mean Value	G-test	df	p-value	G-test (Data)	df (Data)	p-value (Data)
ESent3	I cry during movies.	1.1857	42.2342%	43.0031%	1.0000	3.9520	24,683.1335	36	0.0000%	24,688.6265	36	0.0000%
ESent6	I rarely cry during sad movies.	1.1215	39.9473%	40.6746%	0.9459	4.0925	23,346.5796	36	0.0000%	23,351.4988	36	0.0000%
ESent7	I seldom feel weepy while reading the sad part of a story.	0.6450	22.9743%	23.3925%	0.5440	3.6575	13,426.9567	36	0.0000%	13,428.8537	36	0.0000%
ESent2	I immediately feel sad when hearing of an unhappy event.	0.5636	20.0762%	20.4417%	0.4754	4.1791	11,733.2193	36	0.0000%	11,735.6094	36	0.0000%
ESent5	I am deeply moved by others' misfortunes.	0.5143	18.3184%	18.6519%	0.4337	4.4901	10,705.9261	36	0.0000%	10,707.9183	36	0.0000%
ESent8	I am seldom bothered by the apparent suffering of strangers.	0.4974	17.7160%	18.0386%	0.4195	3.2460	10,353.8665	36	0.0000%	10,355.7313	36	0.0000%
EAnx8	I am not easily disturbed by events.	0.2547	9.0744%	9.2396%	0.2149	4.3584	5,303.3726	36	0.0000%	5,304.2425	36	0.0000%

[Factor_1] - I have leadership abilities._(6)

Associated graph_1_Final.xbl



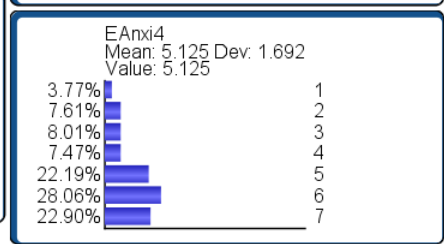
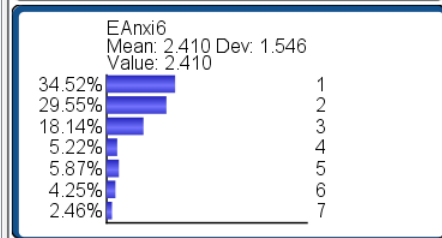
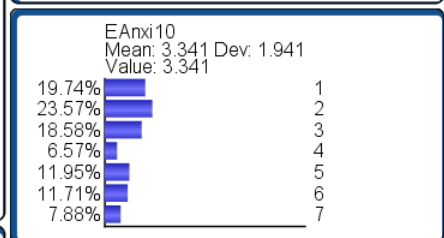
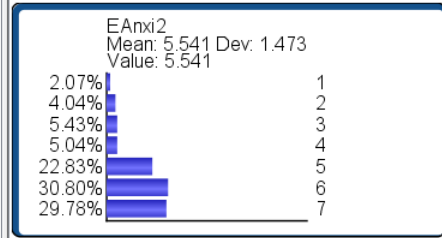
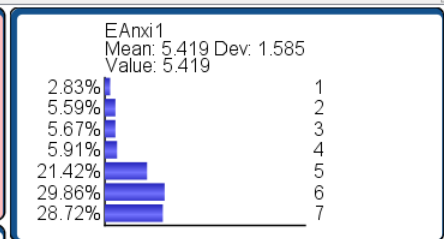
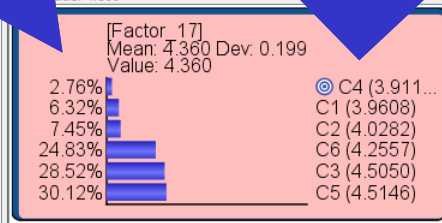
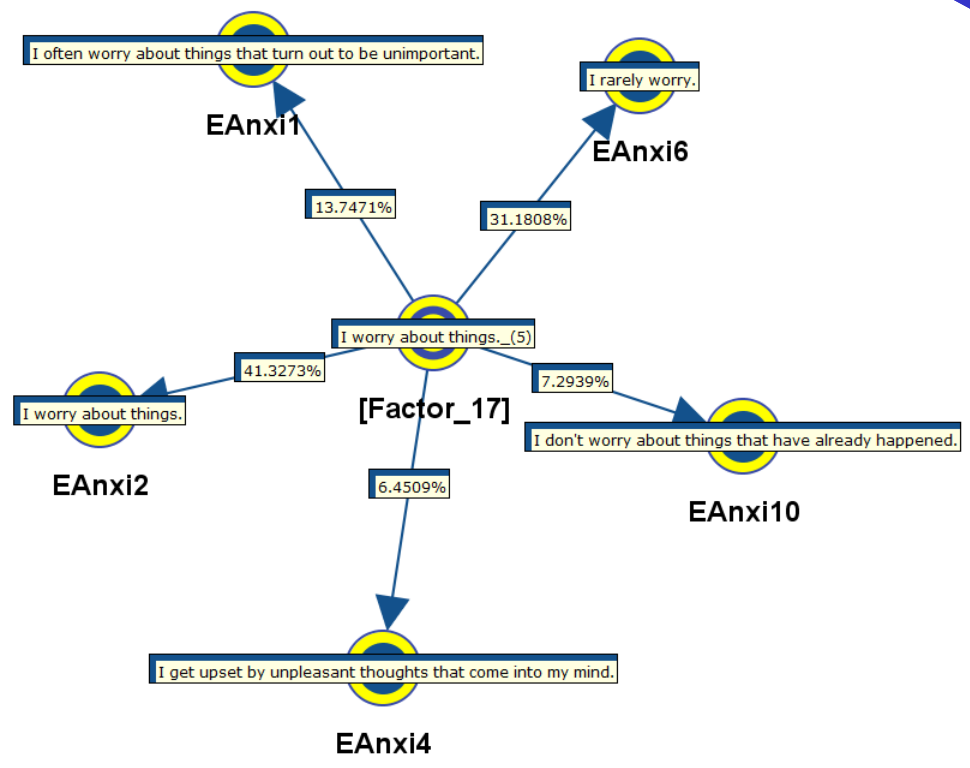


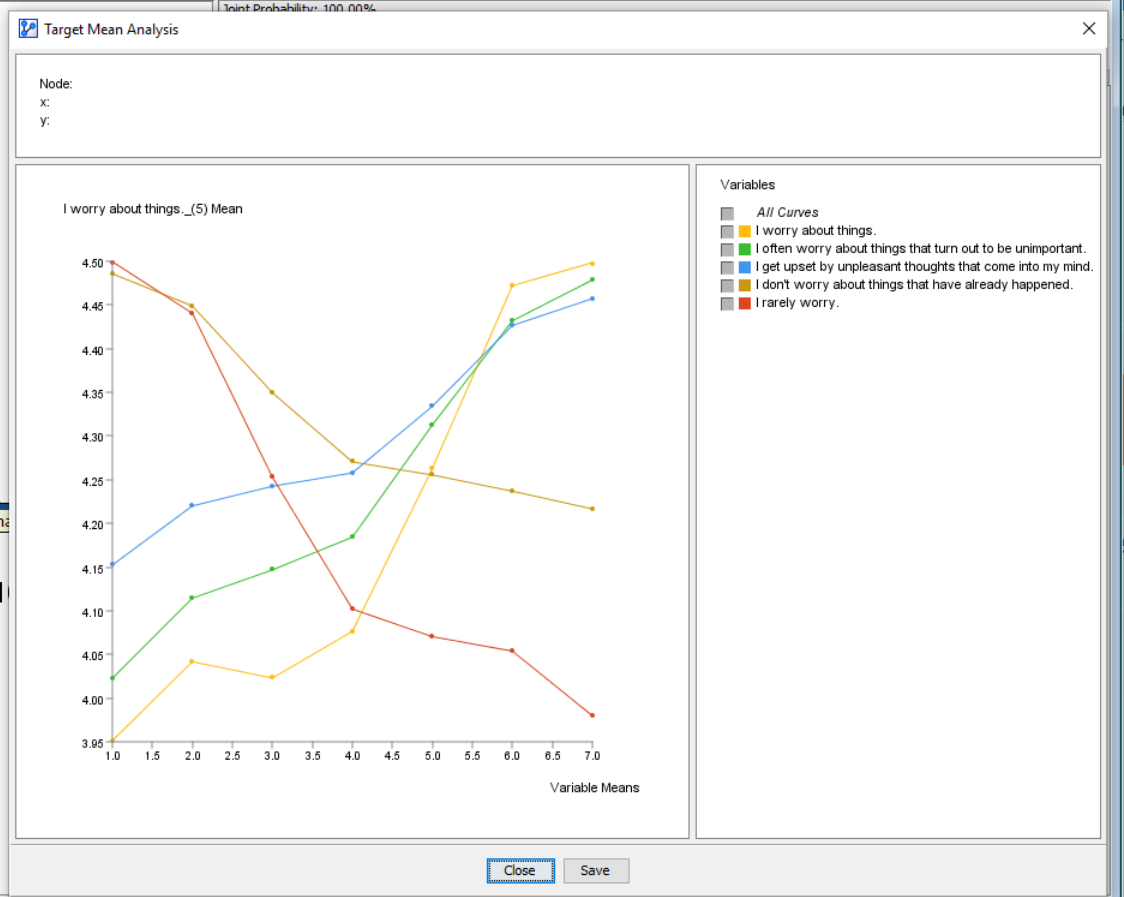
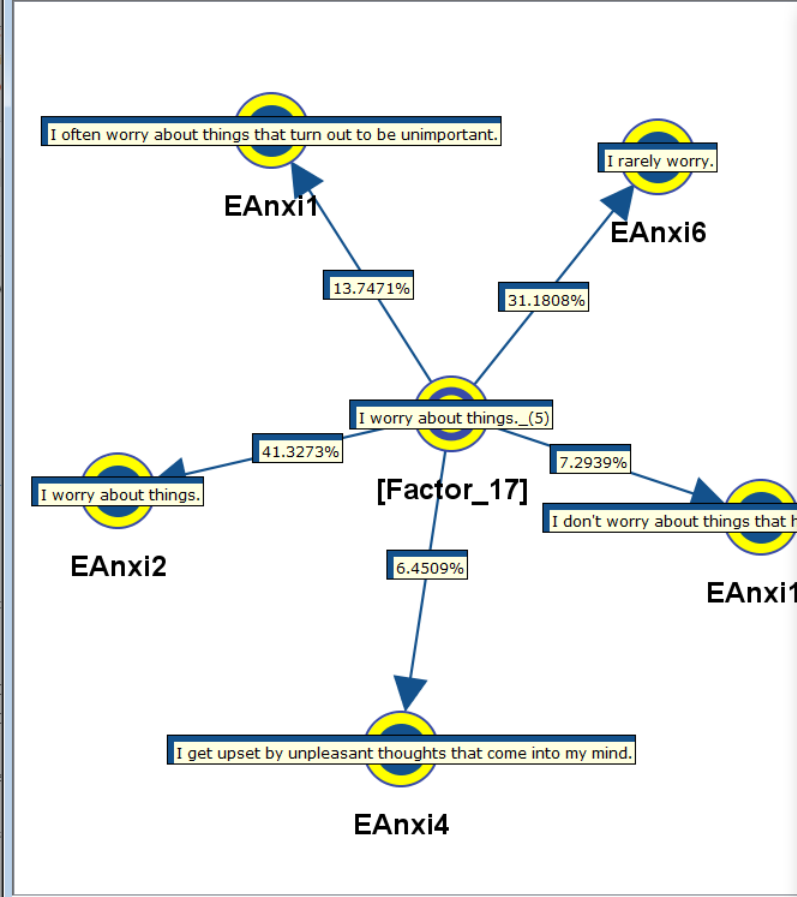




Newly-generated states of Factor 17

Numerical values of the factor states are the weighted averages of the values of the manifest states





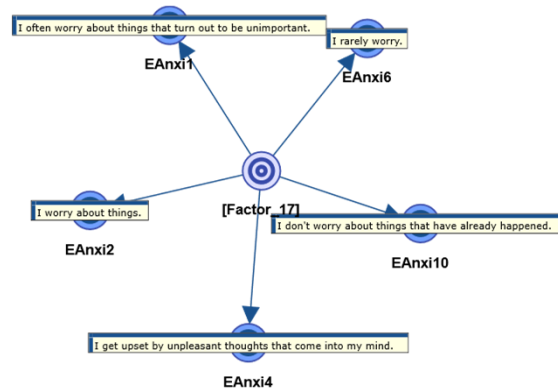
Quality of Representation

Key Measures

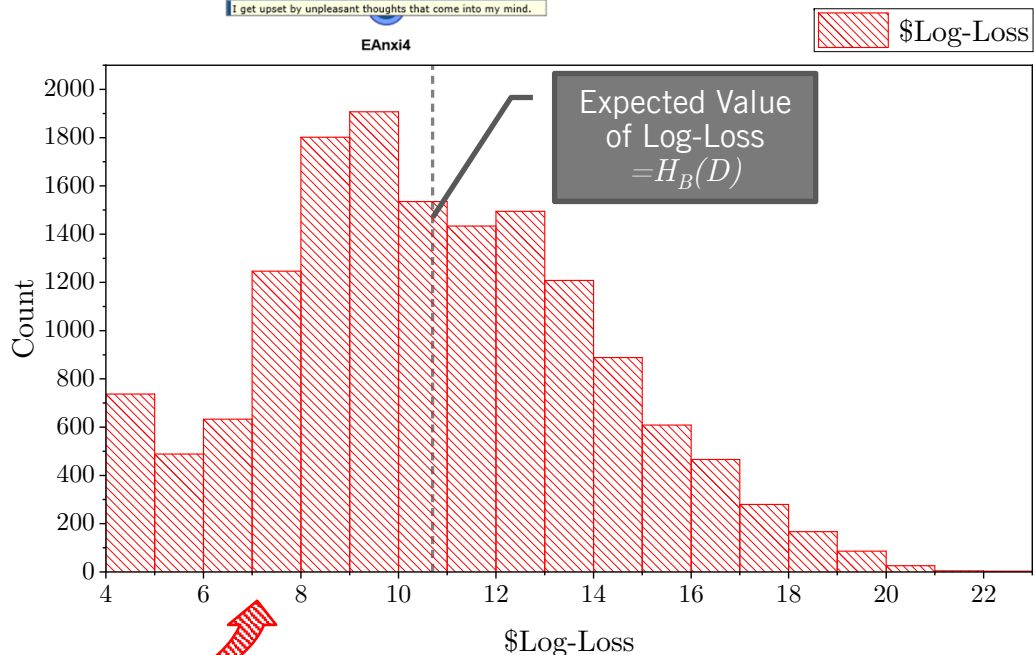
- **Contingency Table Fit**
 - Log-Loss Distribution
 - Entropy
- **Purity**
- Deviance
- Hypercube Cells Per State

Quality Measures

Log-Loss Distribution of Factor 17



EAnxi1	EAnxi2	EAnxi4	EAnxi6	EAnxi10	\$Log-Loss
5	6	6	2	2	7.45
7	6	6	2	2	7.22
6	6	6	1	2	7.39
7	5	7	2	5	13.16
2	2	4	4	5	16.40
5	5	3	3	3	9.37
5	6	5	1	3	10.66
5	6	6	3	5	10.89
7	7	7	1	1	4.59
5	5	5	3	5	8.58
5	5	2	3	3	9.63
7	5	6	2	2	10.23
7	7	7	1	1	4.59
7	7	7	1	4	8.73
7	7	7	1	1	4.59

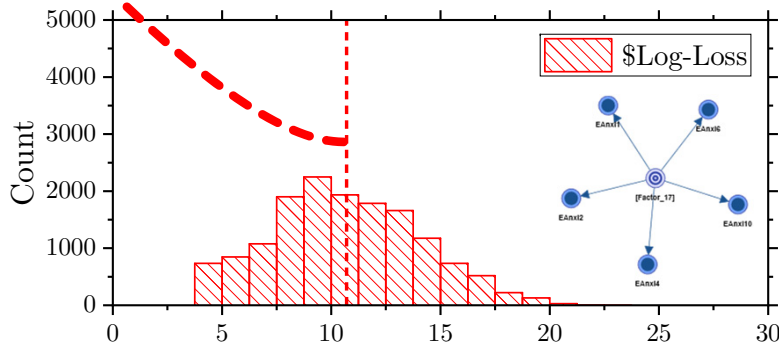
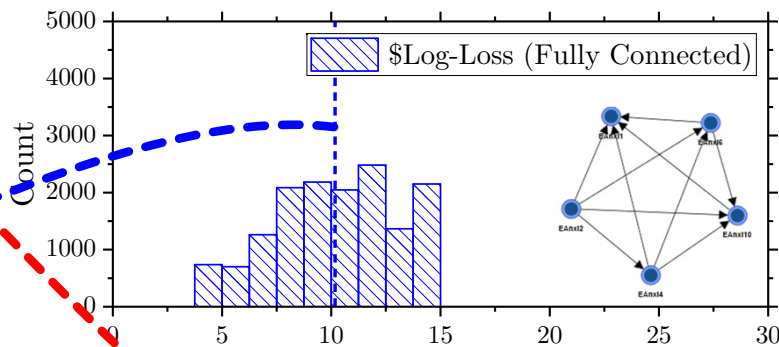
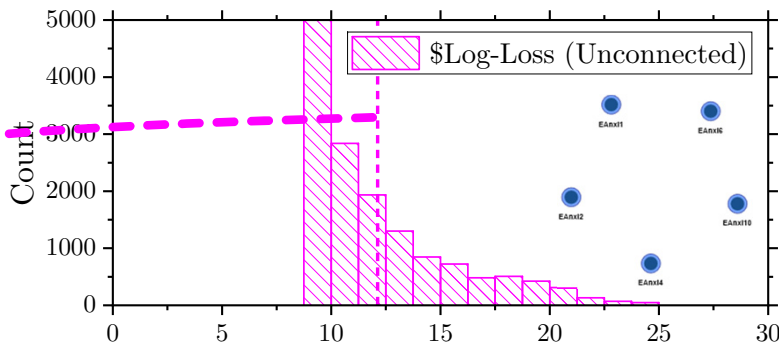


Quality Measures

Contingency Table Fit (CTF)

$$C_B = 100 \times \frac{H_U(D) - H_B(D)}{H_U(D) - H_F(D)}$$

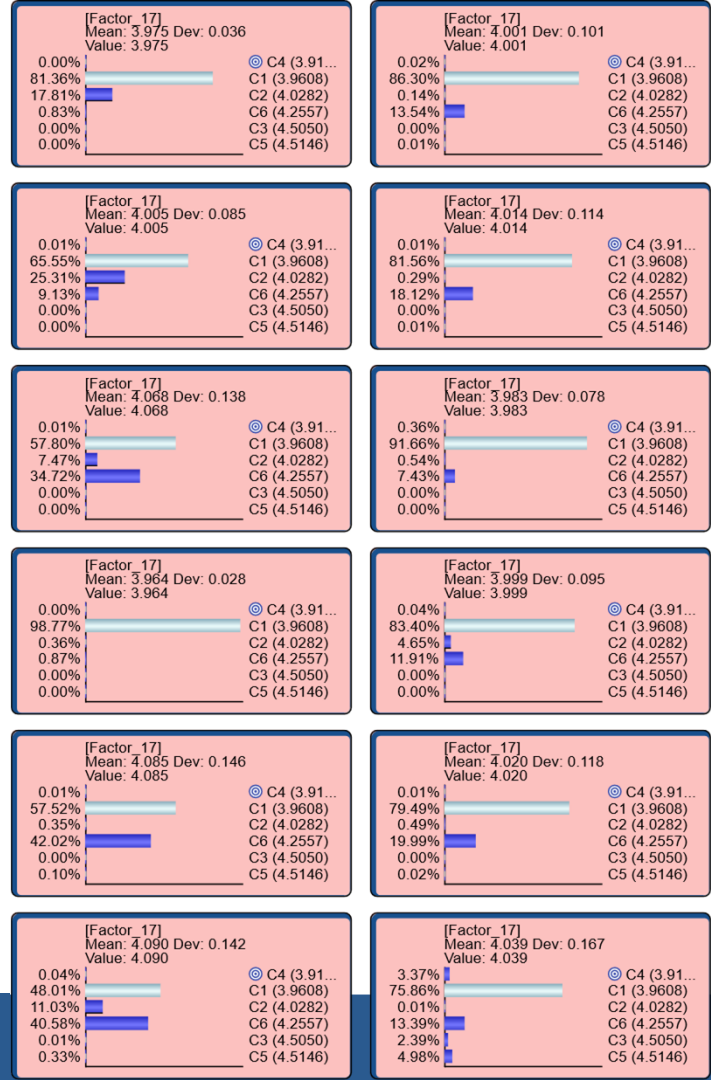
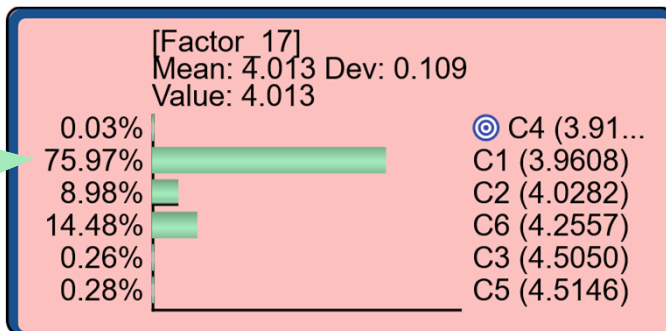
- The CTF measures the quality of the representation of the Joint Probability Distribution by the network.

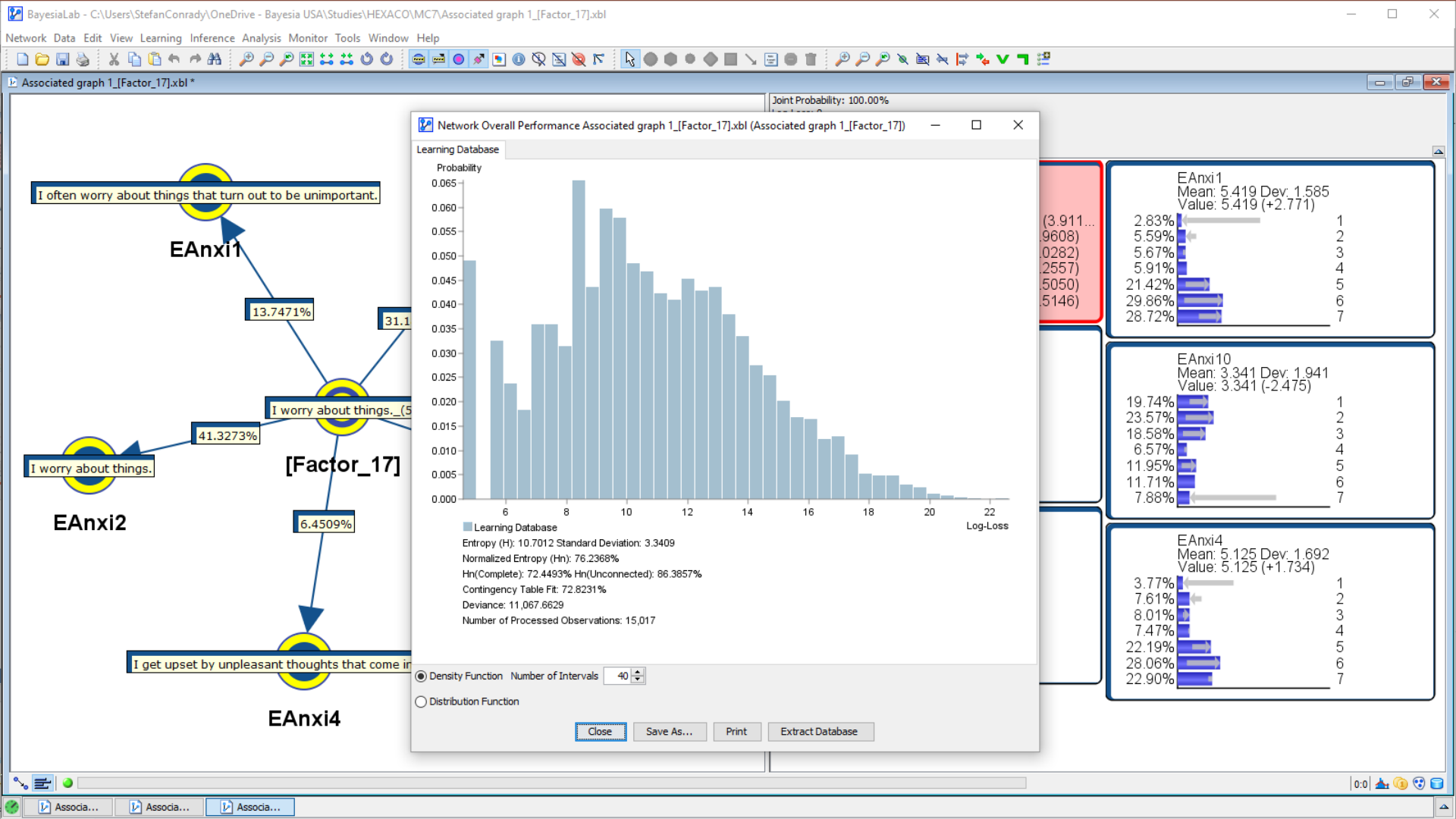


BayesiaLab Workflow

Purity of State C1

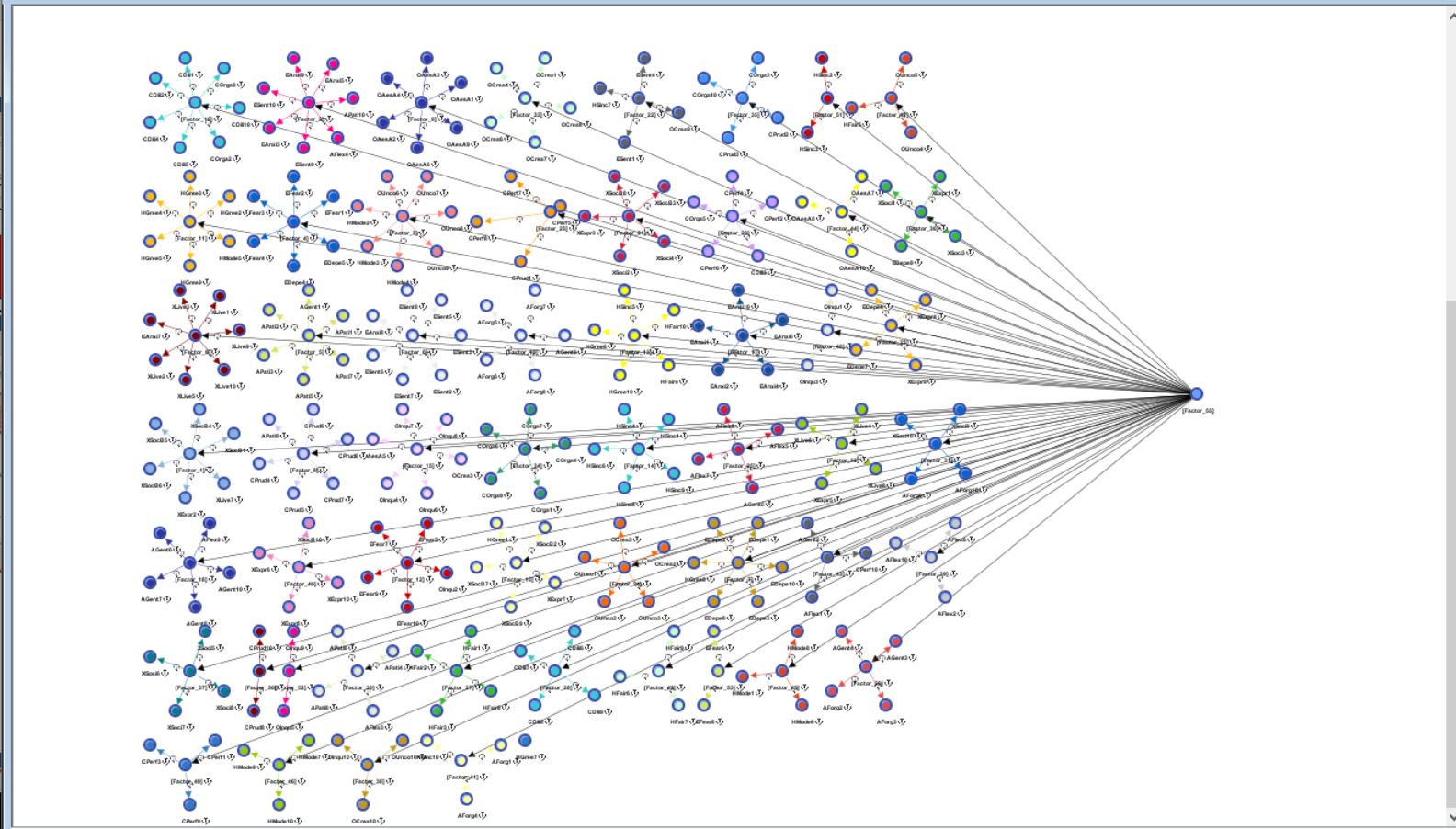
State C1 is
76% "pure"







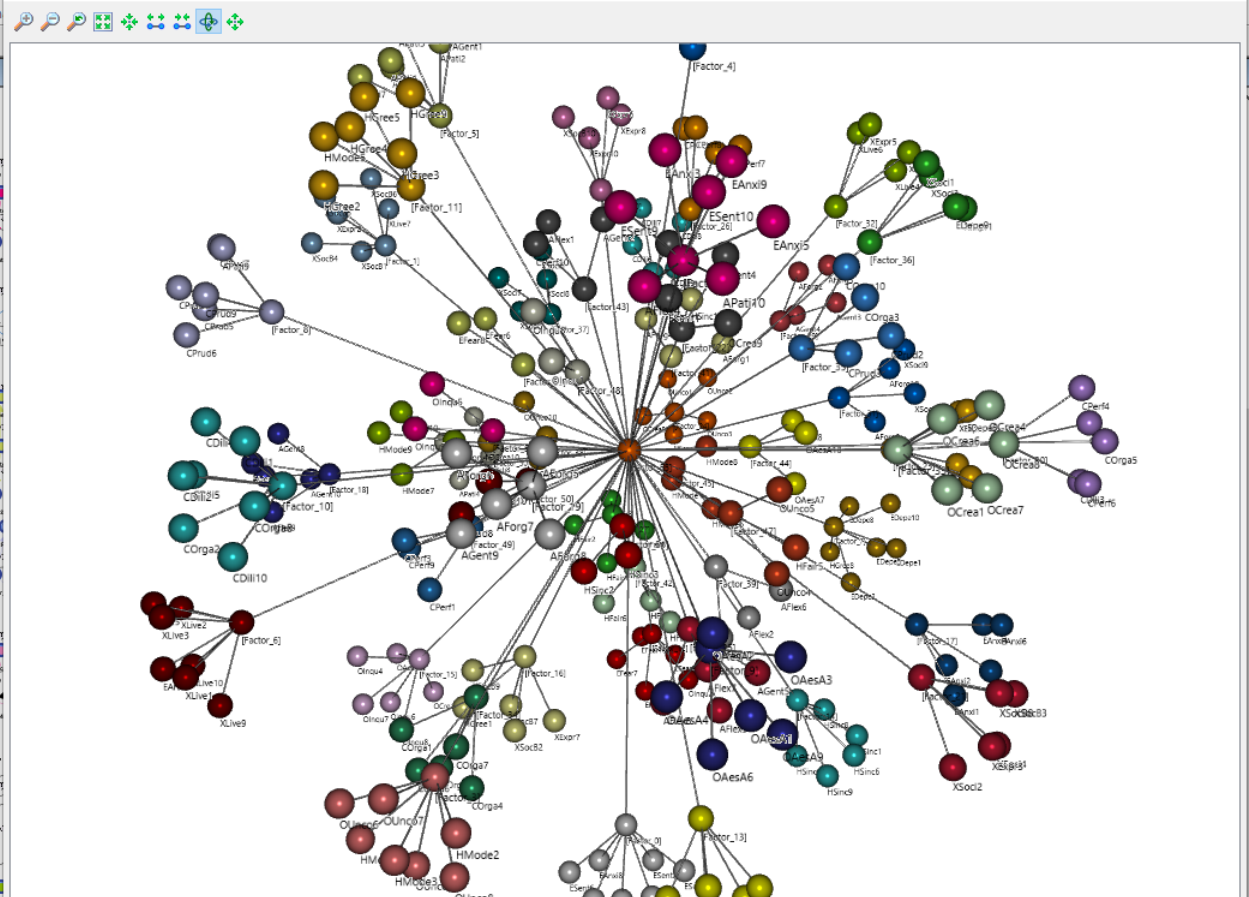
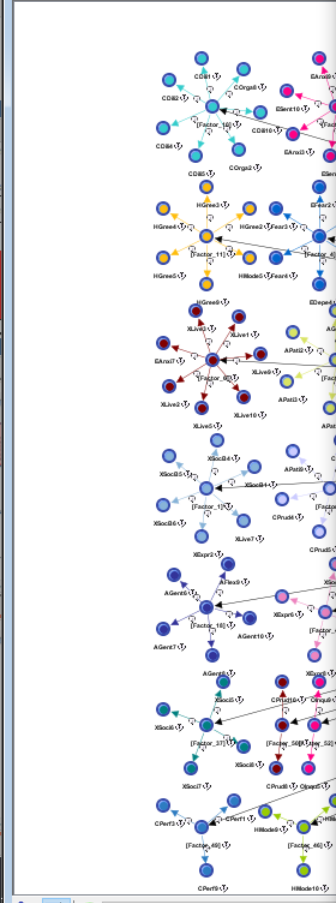
Associated graph_2_Final.xbl*



Joint Probability: 100.00%
Log-Loss: 0
Cases: 15,017
Total Value: 1,239.818
Mean Value: 4.203



Associated graph_2_Final.xbl*



Node Analysis

Size:

Color:

Arc Analysis

Joint Probability: 100.00%
 Log-Loss: 0
 Cases: 15,017
 Total Value: 1,239.818
 Mean Value: 4.203



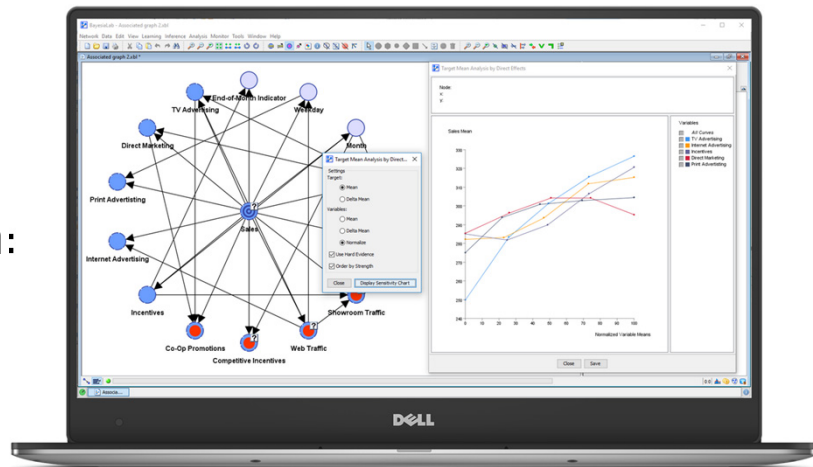
BAYESIALAB

In Conclusion...

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Upcoming Events

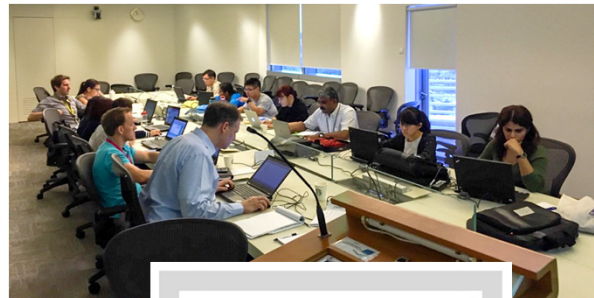
Webinars & Seminars:

- July 13 Webinar: Building a Technical Fault Diagnosis System
- July 27 Webinar: Adversarial Reasoning

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