Trace-Based Reasoning Combining Case-Based Reasoning and Traces to reason on experiences



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Octobre 2016

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Case-Based Reasoning

Case-Based Reasoning





Reusing past experiences to solve new problems

Genesis

- Marvin Minsky [1975] a model of memory -> frames
- Robert Schank [1982], a dynamic memory -> scripts
- CBR cycle [1994], CBR step by step

Minsky's theory

"Here is the essence of the theory: When one encounters a new situation (or makes a substantial change in one's view of the present problem) one selects from memory a structure called a Frame. This is a remembered framework to be adapted to fit reality by changing details as necessary."

Schank introduces dynamic memory

- Understanding ⇐> Explaining
 - Natural language understanding
 - Using scripts to describe propositions
 - Using concrete experience to build incrementally the scripts.

Script memory



Reasoning process according to Schank

- In a memory of concrete experiences (dynamically organized in a generalization hierarchy),
- One retrieves the « closest » experience to the current one,
- The corresponding script has to be generalized as less as possible to be re-specialized in the current context,
- Memory is re-organized if necessary according to what happens really.

Case-Based Reasoning



What is a case?

A case is the description of a problem solving episode.

Its structure fits the situation of the task: diagnostic, planning, decision helping, design, etc.

Case descriptors

- A case is composed of a problem description and its corresponding solution description
- A **source** case is a case whose solution will be adapted to find a solution for a new case, we call **target case**.
- A source case is formulated as: Source_case=(source,Sol(source))
- And a target case: *Target_case=(target,Sol(target))*

Cases in the solution space



Different classes of solutions



Choice of a source case



Case-Based Reasoning



Trace-Based Reasoning



Trace

A trace is nothing without its model



Transformations





A trace is an experience container!

Objects Obsel Model KTBS

Processes Collect Transformation



KTBS: a Kernel for Trace-Based Systems

Properties

Open source Simple data model Extensible



Technical details

RDF for representing its data
RESTful HTTP for interaction
Available in all programming languages
Client API in Python, Java, ActionScript

kTBS in action!





KTBS stores traces!

From Case-Based Reasoning to Trace-Based Reasoning?



Trace-Based Reasoning for user assistance



Trace-Based Reasoning for other purposes



What can we do with traces?

Knowledge acquisition Replay Visualisation Learning Assistance



Co-Construction

of knowledge

Interactive knowledge acquisition, both for humans and machines?



Why should we put the user back in the loop?

App ications

Name: Abstract and Abstract Lite Author: Olivier Georgeon (et al.) Project Type: PhD thesis (and more...) Date: 2007-2011 Collaborations: INRETS

Research issues: Activity traces visualization Tools for human activity analysis Knowledge discovery (a lot of application domains)

Websites: <u>http://liris.cnrs.fr/abstract/</u> <u>http://vm.liris.cnrs.fr:34080/abstract/lite</u>

Case study: Analysis of drivers' behaviours



Abstract





Abstract

A.B.S.T.R.A.C.T.

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Condition:]	Save customization as Name: Save Customization list			Always play last Upload a trace			
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Abstract-lite

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Name:

Author: Raafat Zarka Project Type: Master Research project Date: 2010 Collaborations: SAP (Paris, France) Research issues: Trace-based reasoning for user assistance **Collect of traces Replay of traces** Impact propagation of changes Website:

http://liris.cnrs.fr/raafat.zarka/ReplayTraceDemo/


SAP-BO Explorer



	Obsel Description	Peolav
Current Trace Trace Level 2 • Input openInfoSpace (16:21:34 GMT+0200) systemDefaults (16:21:51 GMT+0200) Exploration categoryValueSelected (16:21:55 GMT+0200) categoryValueSelected (16:21:59 GMT+0200) drillDown (16:22:08 GMT+0200) Visualization groupingSortingChanged (16:22:19 GMT+0200) chartTypeChanged (16:22:23 GMT+0200) Cutput email (16:22:27 GMT+0200) closeInfoSpace (16:22:44 GMT+0200)	Obsel Description Attribute label startTime endTime block category ataSource (id=" ataSource (id=" measure (id=" measure (id=" measure (id="	Non Aug 9 16:21:51 GMT+0200 2010 Mon Aug 9 16:21:51 GMT+0200 2010 Mon Aug 9 16:21:51 GMT+0200 2010 2 Exploration

SAP-BO Explorer



Name: Wanaclip 12053510F Author: Raafat Zarka Project Type: PhD (French National grar Date: 2011 Collaborations: Webcastor (Lyon, France) Research issues: Trace-based reasoning for user assistance Collect Trace-based recommendations

Website: http://liris.cnrs.fr/raafat.zarka/



Wanaclip



ie: Taaable

Author: Amélie Cordier (et al.)

Project Type: Open project

Date: 2008-2011



Collaborations: LORIA, LINA, LIPN (French labs.)

Research issues: Case-based Cooking Knowledge representation Collaborative work Semantic wikis

Websites: <u>http://taaable.fr/</u> <u>http://computercookingcontest.net</u>

ABOUT TAAABLE



Taaable components

My strawberry pi	t history delate move protect	view source his	tory
2 Preparation 3 Substitutions	Category:Ber	ry	
4 Other information	Description		
 1/2 c Water 1 1/2 c Sugar 1 Pie crust (9 inch), baked 1 1/2 qt Strawberries 1/3 c Cornstarch 	The botanical definition of fleshy fruit produced from Read the whole article of	of a berry is a n a single ovary. n <i>Wikipedia</i> 🚱	
 3 c Cool whip 	Lexical variants	F	ecipes using Berry
Preparation Chop 2 cups of berries. In strawberries. Cook, stiming of mixture into prepared pi strawberries. Chill until fm	 English: berry Français: baie Deutsch: Beere Español: Baya 	:	Cran-raspberry relish Spicy cranberry chutney
Substitutions	Subcategories		
Substitution 1 in My strawbe Substitution 2 in My strawbe	в	C cont.	к
	= [+] Baby kiwifruit (0)	= [+] Currant (0)	= [+] Kiwi fruit (0)
Other information	= [+] Blackberry (0) = [+] Blueberry (0)	F	R
Produces dish type: Baker	c	= [+] Fraise des boi	s (0) = [+] Raspberry (0)
Can be eaten as: Dessert	= [+] Crapherry (0)	G	S
	= [·] cranberry (c)	= [+] Grape (3)	I+1 Strawberry (0)





Reasoning Process



Knowledge Discovery Process



Taaable CBR engine

Adaptation of recipesExample

I want a dessert, with apples but no cinnamon

Adaptation

Adapt "My Strawberry Pie", because I do not have strawberry



Taaable knowledge

WikiTaaable

Semantic Wiki

Ontology



Category: Fruit

And some recipes

Contents [hide]	
1 Ingredients	
2 Preparation	
3 Substitutions	
4 Other information	
ngredients	[edit
- 14/2 - Super	
= 1 1/2 c Sugar	
 1 1/2 c Sugar 1 Pie crust (9 inch), baked 	
 1 1/2 c Sugar 1 Pie crust (9 inch), baked 1 1/2 qt Strawberries 	
 1 1/2 c Sugar 1 Pie crust (9 inch), baked 1 1/2 qt Strawberries 1/3 c Cornstarch 	



Preparation

[edit]

Chop 2 cups of berries. In saucepan combine sugar and cornstarch. Slowly add water to combine smoothly. Add chopped strawberries. Cook, stirring constantly until mixture thickens and boils. Cool in refrigerator for about 1/2 hour. Pour about 3/4 of mixture into prepared pie crust. Stand up whole strawberries in syrup (to fill crust). Pour remaining syrup over strawberries. Chill until firm (about 3 hours). Spread cool whip over top of pie and serve.

User interface

To	(2)	110	
la	aa	Die	

dessert_dish rice fig			Find recipes!	Clear
Dietary practices: Vegetarian alcohol Low cholesterol Adapt a specific recipe	Nut-freeGout Diet	🖾 No	Customize your dieta practices	лу
Example. If you want an apple pie withou -cinnamon".	t cinnamon, enter "ap	ople pie_dish	Learn more about ad queries	<u>lvanced</u>

Your request is: dessert_dish fig rice

The request used for adaptation is: dessert_dish fig rice

#	Original recipe name (click to open recipe)	Adaptation overview (click to see the details)
1	Glutinous_rice_with_mangoes	Replace: Mango by Fig
Res	sults 1 - 1 on 1 Processing time: 0.6189 seconds	



Reasoning process

- Adaptation
 - Retrieve similar recipes
 - Replace some ingredients by others





Examples of adaptation

Glutinous rice with mangoes

	The ingredient substitutions	OK not OK
1.	Mango -> Fig	

Ingredient Quantities

Ingredient	Initial Quantity	New Quantity
Salt	=	1 tsp (7.0 grams)
Mango	6 whole (1242.0 grams)	0 whole (0.0 grams)
Coconut cream	=	2 cup (648.0 grams)
<u>Glutinous rice</u>	=	3 cup (522.0 grams)
Sesame seed	2 tbsp (16.0 grams)	1 tbsp (10.0 grams)
Fig	0 grams (0.0 grams)	1242 grams
Sugar	=	2 cup (625.0 grams)

Preparation Adaptation

<u>Cut figs into wedges.</u> SEASONINGS SAUCE GARNISH Soak the rice in cold water for 2 hours. Drain. Line a steamer with cheesecloth, heat steamer and lay rice on the cheesecloth. Steam for 30 minutes or until cooked through. The rice will become glossy. Mix the SEASONINGS_ingredients in a large bowl and gently mix in the hot steamed rice. Cover tightly and let soak for 30 minutes to absorb the coconut flavour. Blend the SAUCE_ingredients in a pot and heat until it just reaches the boiling point. Let cool. Peel the mangoes, slice lengthwise and remove the pits. Divide the rice among 6 plates. Place mango-fig slices on top and cover with the sauce. Sprinkle with the sesame seeds and serve.

Show details

Adaptation Knowledge Acquisition

 Based on the extraction of closed itemsets on variations of ingredients in recipes



ADAPTATION RULES FOR My Strawberry Pie ACCORDING TO -strawberry

Strawberry, CoolWhip \rightarrow	Cherry, RedFoodColoring	OK	not OK
Strawberry, CoolWhip \rightarrow	Raspberry	OK	not OK
Strawberry, CoolWhip \rightarrow	Peach	OK	not OK
Strawberry, CoolWhip \rightarrow	Apple, AppleJuice	OK	not OK
Strawberry, CoolWhip \rightarrow	Cranberry, Mincemeat	OK	not OK



Adaptation knowledge in a semantic wiki

page discussion cuit instory delete move pr	rotect watch
Substitution 1 in My strawberry pie	
Contents [hide]	
1 In Context	
2 Replace	
3 Ву	
4 Origin	
In Context	[edit]
My strawberry pie	
Replace	[edit]
Ingredient : Strawberry	
Ву	[edit]
Ingredient : Raspberry	
Origin	[edit]
Adaptation source : Taaable	
Category: Specific substitution	



Adaptation knowledge





Taaable writing bot

Glutinous rice with mangoes

The ingredient substitutions

not OK

OK

Mango → Fig



Recipe and substitution

Contents [hide]					
1 Ingredients					
2 Preparation					
3 Substitutions					
4 Other information					
Ingredients					
■ 1/2 c Water					
1 1/2 c Sugar					
1 Pie crust (9 inch), baked					
1 1/2 qt Strawberries					
10 0 1					
1/3 c Cornstarch					
Transform Transform Transform Transform Chop 2 cups of berries. In saucep	van combine sugar an	d cornstarch. Sile	owly add wate	er to combine sm	pothly. Add chopp
 1/3 c Constarch 3 c Cool whip Preparation Chop 2 cups of berries. In saucer strawberries. Cook, stirring const of mixture into prepared pie crust strawberries. Chill until firm (about Substitutions 	an combine sugar an antly until mixture thic Stand up whole strav t 3 hours). Spread coo	d cornstarch. Sk kens and boils. vberries in syrup I whip over top o	owly add wate Cool in refrige o (to fill crust). of pie and sen	er to combine sm erator for about 1/ Pour remaining : /e.	oothly. Add chopp 2 hour. Pour abou syrup over
 1/3 c Cornstarch 3 c Cool whip Preparation Chop 2 cups of berries. In saucer strawberries. Cook, stirring const of mixture into prepared pie crust strawberries. Chill until firm (about Substitutions 	an combine sugar an antly until mixture thic Stand up whole straw t 3 hours). Spread coo	d cornstarch. Sik kens and boils. vberries in syrup of whip over top of	owly add wate Cool in refrige o (to fill crust). of pie and ser	er to combine sm erator for about 1/ Pour remaining : ve.	oothly. Add chopp '2 hour. Pour abou syrup over
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Kolflow aims at building a **social semantic space** where **humans** collaborate with **smart agents** in order to produce **knowledge understandable** by humans and machines









pear pie_dish		Find recipes!	Clear
Dietary practices: Vegetarian Nut-free	🗖 No alcohol	Customize your cietar	y pracfices
Example. If you want an apple pie without cinnamon enter "apple	pie_dish -cinnamon".	Learn more abou! adv	anced querie

Your request is: pear pie_dish

The request used for adaptation is: pear pie_dish

- # Original recipe name (click to open recipe)
- 1 La tarte tatin
- 2 Custard apple_tart
- 3 Individual_almond-cream_tarts
- Results 1 3 on 3 | Processing time: 0.6166 seconds

Adaptation overview (click to see the details)Replace: Golden delicious apple by PearReplace: Apple by PearReplace: Apple by Pear



Help me! Video tutorials About Taaable WikiTaaable Administration

Taaable 3 - Copyleft Tasable Team 2010





Category:Food

Taaable

navigation

- Main page
- Community portal
- Current events
- Recent changes
- Random page
- Help

search

Go Search

toolbox

- What links here
- Related changes
- Special pages
- Printable version
- Permanent link
- Browse properties

Description

Food is any substance consumed to provide nutritional support for the body. It is usually of plant or animal origin, and contains essential nutrients, suc vitamins, or minerals...

Read the whole article on Wikipedia @

Lexical Variants

- English: Food (Food)
- Français: Aliment (Aliments)
- Deutsch: Lebensmittel (Plural not available)
- Español: Alimento (Alimentos)

Recipes using food

ForNavigationPurposeViewPoint

Subcategories

This category has the following 19 subcategories, out of 19 total.

Α	F cont.	M
[+] Accompaniment (7)	[+] Foodcomponent (4)	[+] Meat (12)
в	= [+] Fruit (10)	0
[+] Baking mix (5)	G	[+] Oil (18)
	C10 1 (0)	

Taaable



How to cook a perfect love story





Best Music Award at IJCAI 2009 Video Competition

http://www.youtube.com/watch?v=UMJyZnfqwYQ

Taaable

Name: Kolflow ANR KOIfiow Author: Kolflow team Project Type: ANR Contint Project Date: 2011-2014 Collaborations: LORIA, LINA, INRIA Research issues: Co-Construction of knowledge Trace-based user assistance Semantic wikis Websites: <u>http://kolflow.univ-nantes.fr</u>

DSMW

Home

DSMW is an extension of Semantic Mediawiki & (SMW). It allows to create a network of SMW servers that share common semantic wiki pages. DSMW manages synchronisation of shared semantic pages and ensures CCI consistency as in Google Wave . CCI stands for Causality, Convergence, Intentions (see papers for more informations). DSMW provides to SMW nearly the same features as a Distributed Version Control & systems:

- you can work in isolation with your own server, test some stuff,
- publish changes to your own DSMW public feeds,
 - you can also subscribe to any remote public DSMW feeds.

By this way, users can implements their own dataflows and represents any kind of dataflow oriented processes such as edit/review/publish.

DSMW is a network of a semantic wikis servers (DSMW peers). The number of peer is unknown. Semantic wiki pages can be replicated on several DSMW servers. A peer can replicate all or just some semantic wiki pages. The communication between DSMW peers is made through channels (feeds). This feeds are transporting operations that, when applied, modify local semantic wiki pages. If you are common to version control systems, a DSMW peer can be seen as a workspace, and a feed can be seen as a branch. DSMW works as follow:

- When a semantic wiki page is updated on a DSMW server, it generates a set of corresponding operations (Patch).
- The user can publish this patch into channels (PushFeed). The publication mechanism uses a semantic query. This query defines the pages' patches to be published (pushed).
- An authorized server can pull the patch(es) and integrated it (them) to the local replica of the pages. If needed, the integration process merges this modification with concurrent ones, generated either locally or received from a remote server. To do this, the user must create a PullFeed with the corresponding PushFeed features. For more information see (DSMW User Manual).

The system is correct if it ensure Causality, Convergence and Intention Preservations. Generation and integration is managed by the Logoot algorithm (see papers). DSMW allows users to build their own cooperative networks. The construction of the collaborative community is declarative in the sense every user declares explicitly with whom she would like to



http://dsmw.loria.fr/

Kolflow



navigation

- Main Page
- Download/Install
- Licensing:
- Getting Started
- FAQ
 Team
- Recent changes

documentation

 DSMW User Manual
 Presentation and Papers

community

- Support
- Contributing
- Issue tracker
 Forums
- Mailing lists
- News
- Roadmap

developpers

- Gforge Home
- Source documentation
- Source code

Name: **IIBM: Intelligent Interaction Based on** Motion Author: Amélie Cordier (et al.) Project Type: Internal Project Date: 2009-2011 Collaborations: Multidisciplinary project Research issues: Motion capture



Intelligent interactions Trace-based user assistance

Website: <u>http://liris.cnrs.fr/iibm</u>



Kinect OpenNI / NITE

















Name: Scheme Emerger Author: Damien Cram Project Type: PhD, ANR Procogec Date: 2010 Collaborations: Knowings, DFKI Research issues: Sequence Mining Chronicle discovery **Trace analysis** Website: http://sourceforge.net/projects/schemerger/



Scheme Emerger

Name: IDEAL: Implementation of DEvelopmentAl Learning Author: Olivier Georgeon

Project Type: ANR RPDoc

Date: 2010-2013



Collaborations: Pennsylvania State University, Sarah Lawrence College (NY) <u>Research issues: Early-stage cognitive development</u>

Intrisic motivation Emergent situation awareness Autonomous hierarchical skill learning Websites: <u>http://e-ernest.blogspot.com/</u> <u>http://liris.cnrs.fr/ideal/demo/</u>











An evolution of Ernest



IDEAL










Interact with Ernest in 3D







Name: Advene / ACAV Author: Yannick Prié (et al.) Project Type: ANR Date: 2008-... Collaborations: Dailymotion Eurecom Research issues: Collaborative Annotations for Video Accessibility Interaction traces

Website: http://blog.dailymotion.com/acav/



Advene



Advene



Advene

Name: VISU Author: Yannick Prié (et al.) Project Type: ANR (Project ITHACA) Date: 2008-2011 Collaborations: Lyon 1, Lyon 2, TECFA Research issues: Interactive Traces for Humain

Websites:

http://liris.cnrs.fr/ithaca/

VISU Accueil Utilisateurs Séances S	alon synchrone	Salon de rétrospecti	on		Langage :	Français	Chat	Déconnexion
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snob (fumer) un cigare poussette								
tente faire la manche chien	- mes		~					
bouteille de vin Sans Domicile Fixe (S.D.F.)	Prié	1						

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