



# Multimodel-based exploration of the building design space and its uncertainty

Hervé Pruvost

Dr. Peter Katranuschkov

Prof. Raimar Scherer

Sustainable Places 2017,  
28<sup>th</sup>-30<sup>th</sup> June, Teesside University,  
Middlesbrough (United kingdom)



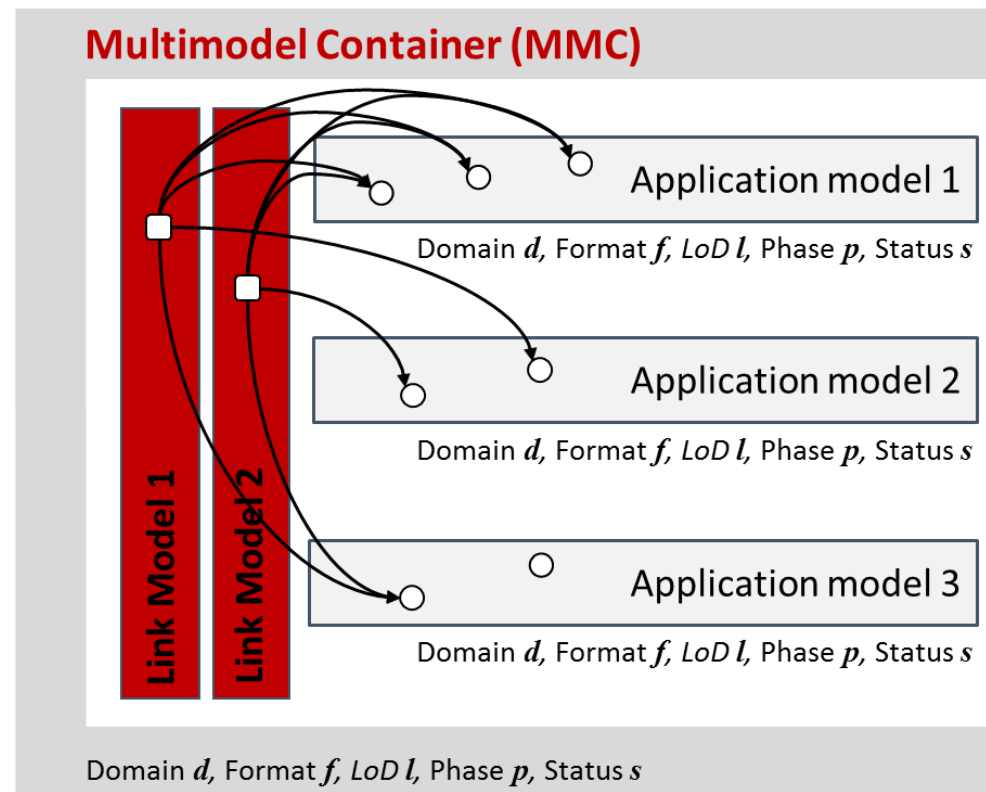
1. Multimodel method: motivation and usage
2. Extension of Multimodel method for BIM design space exploration
3. Integration of uncertainty in BIM information space
4. Simulation and collection of computed metrics

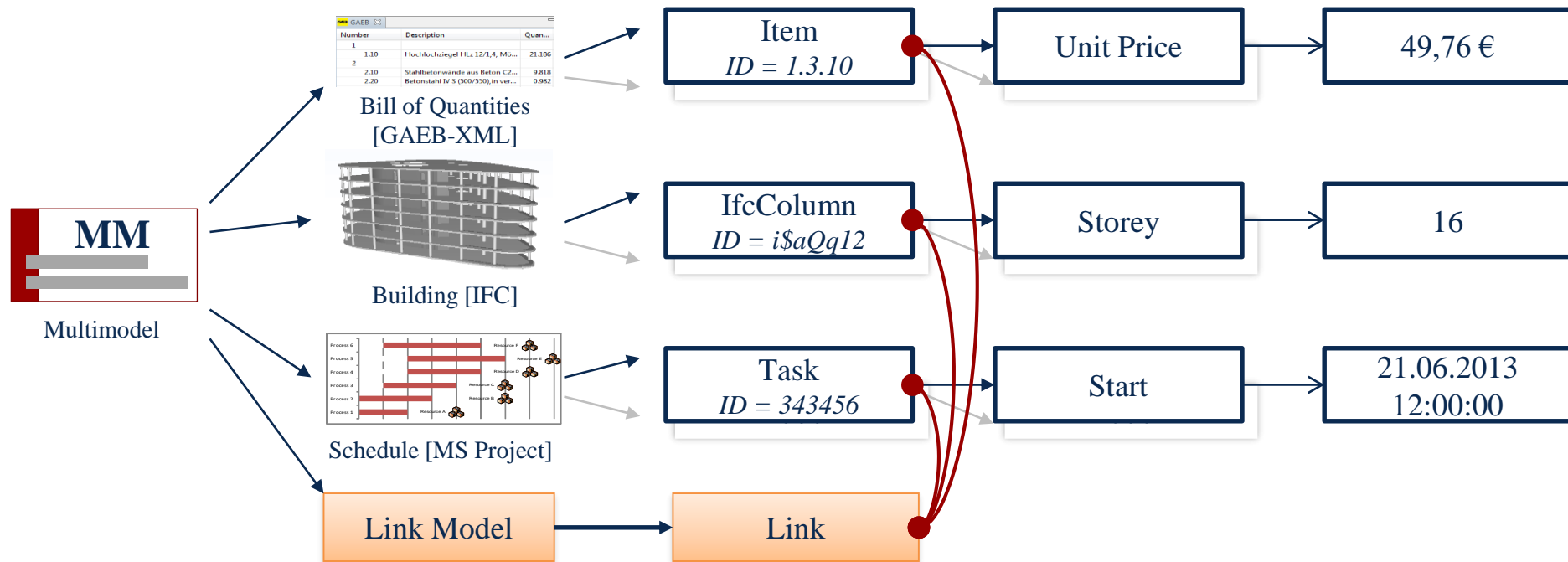
- Multimodel:
  - Initially developed in German research project „Mefisto“ (2009-2012), further development since then:
    - buildingSMART „MMC Project“
    - DIN-SPEC 91350
    - ISO/NP 21597 (Information Container for Data Drop)
  - Proposes a method and a data exchange model for integrating and linking together information from different engineering domains
  - Offers a exchangeable project data resource for enabling and easing collaboration in building design and construction.
  - Integrate heterogeneous and domain-specific data into a common data exchange model while maintaining native data formats.

- Goals of this work:
  - Enabling building design optimization with regard to several criteria reflecting different engineering domains.
  - Integrate different heterogeneous information from different application domains for the sake of a energy-efficient building design
  - Allow for making and modelling several changes in this information
  - Support uncertainty analysis of different building design options
  - In one single simulation request, simulates  $n$  (1 to hundreds) different building design options

**Multimodel = set of  $m$  application models and  $n$  link models + annotations as metadata.**

- Application Model
  - Embedded or referenced
  - Multiple files and formats (IFC, GaebXML, CSV, etc.)
- Link Model
  - links.xml
  - LinkModel.xsd
- Multimodel metadata
  - multimodel.xml
  - MultiModel.xsd
- Container
  - Contain all data mentioned above (e.g. as zip file)

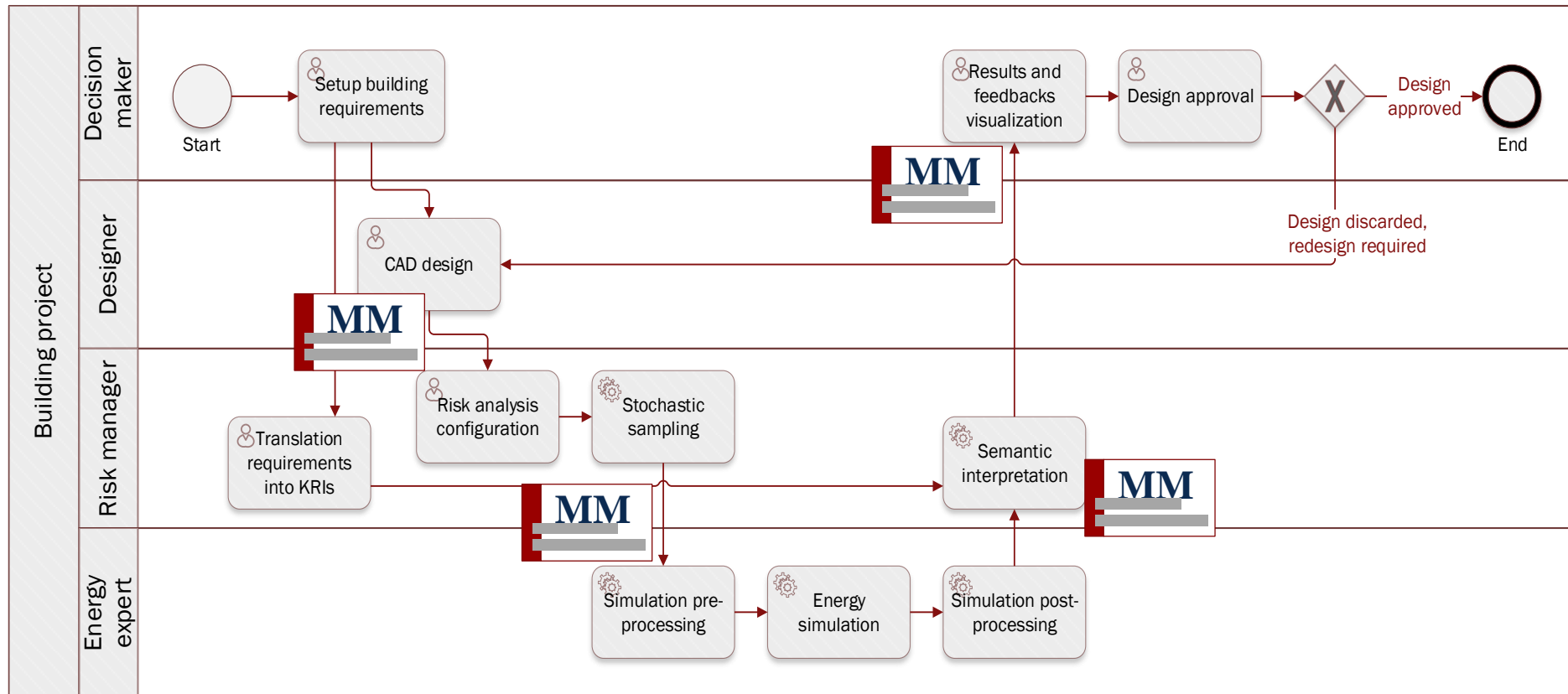




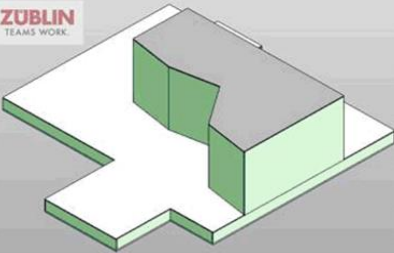
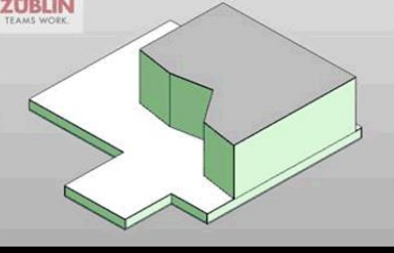
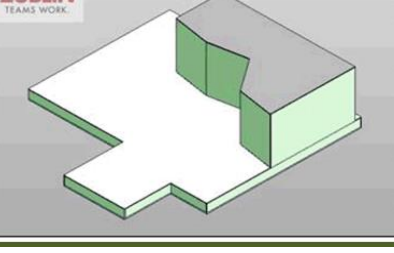
Multimodel:

**Explicit, neutral & ID-based links** between the application model's elements

- Simplified BPMN diagram of a design workflow focusing on building energy



# Extension of MM for support of different design solutions and uncertainty analysis

URBAN DESIGN VARIANTS					
Alternatives (IFC model)		Architecture		Energy System	
		Variants		Variants	
Alternative-1 (original state) 	<b>Variant Type-1</b>	<b>WWR</b>		<b>Variant Type-4</b>	<b>Heating system</b>
	Variant-1.1		35%	Variant-4.1	District heating
	Variant-1.2		50%	Variant-4.2	Natural Gas
				Variant-4.3	Solar heating
	<b>Variant Type-2</b>	<b>Orientation</b>			
	Variant-2.1		0°		
	Variant-2.2		180°		
	<b>Variant Type-3</b>	<b>Fassade/Shell</b>			
	Variant-3.1		Heavy		
	Variant-3.2		Lightweight		
Alternative-2 (increased size) 	<b>Variant Type-1</b>	<b>WWR</b>		<b>Variant Type-4</b>	<b>Heating system</b>
	Variant-1.1		35%	Variant-4.1	District heating
	Variant-1.2		50%	Variant-4.2	Natural Gas
				Variant-4.3	Solar heating
	<b>Variant Type-2</b>	<b>Orientation</b>			
	Variant-2.1		0°		
	Variant-2.2		180°		
	<b>Variant Type-3</b>	<b>Fassade/Shell</b>			
	Variant-3.1		Heavy		
	Variant-3.2		Lightweight		
Alternative-3 (changed position) 	<b>Variant Type-1</b>	<b>WWR</b>		<b>Variant Type-4</b>	<b>Heating system</b>
	Variant-1.1		35%	Variant-4.1	District heating
	Variant-1.2		50%	Variant-4.2	Natural Gas
				Variant-4.3	Solar heating
	<b>Variant Type-2</b>	<b>Orientation</b>			
	Variant-2.1		0°		
	Variant-2.2		180°		
	<b>Variant Type-3</b>	<b>Fassade/Shell</b>			
	Variant-3.1		Heavy		
	Variant-3.2		Lightweight		

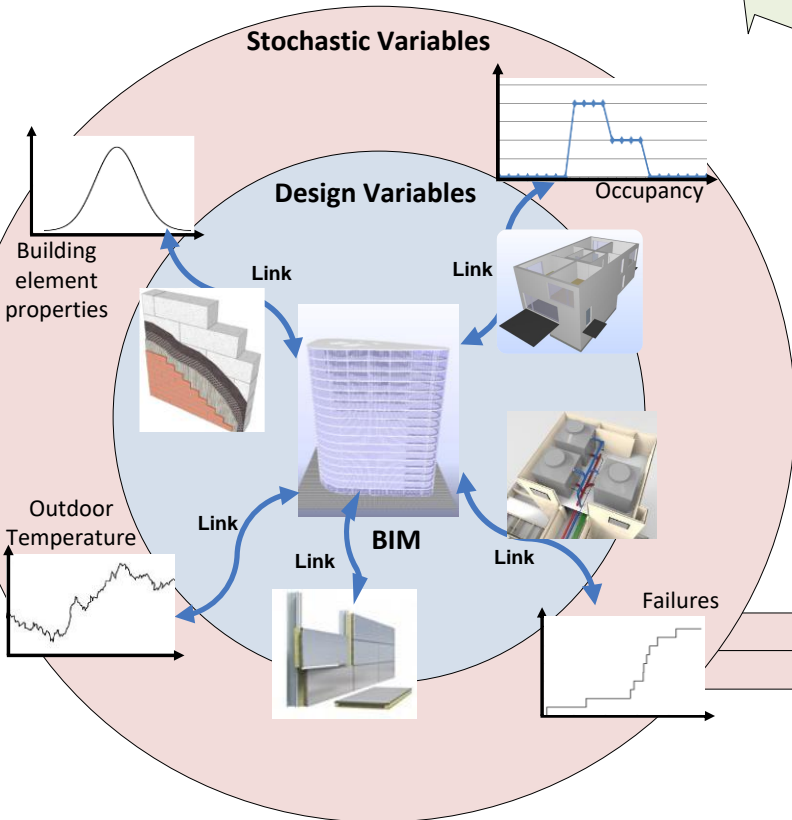
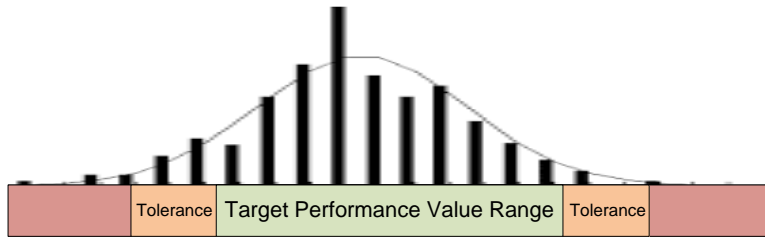
## 3 levels of Multimodel data variations:

- Design alternatives:
  - one IFC model each
- Design variants:
  - Based on design alternatives
  - one Link Model each
- Stochastic realizations:
  - Based on design variants
  - Set of randomly sampled values of some specific variables

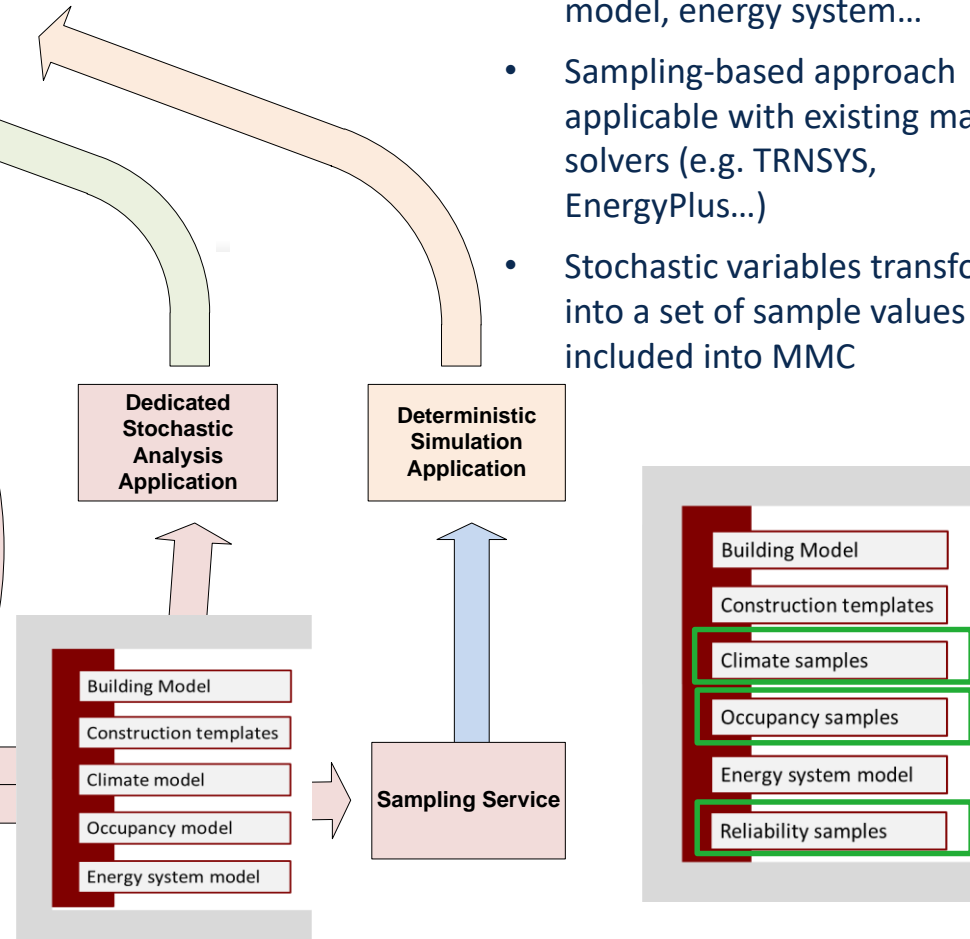
IFC model as central product model

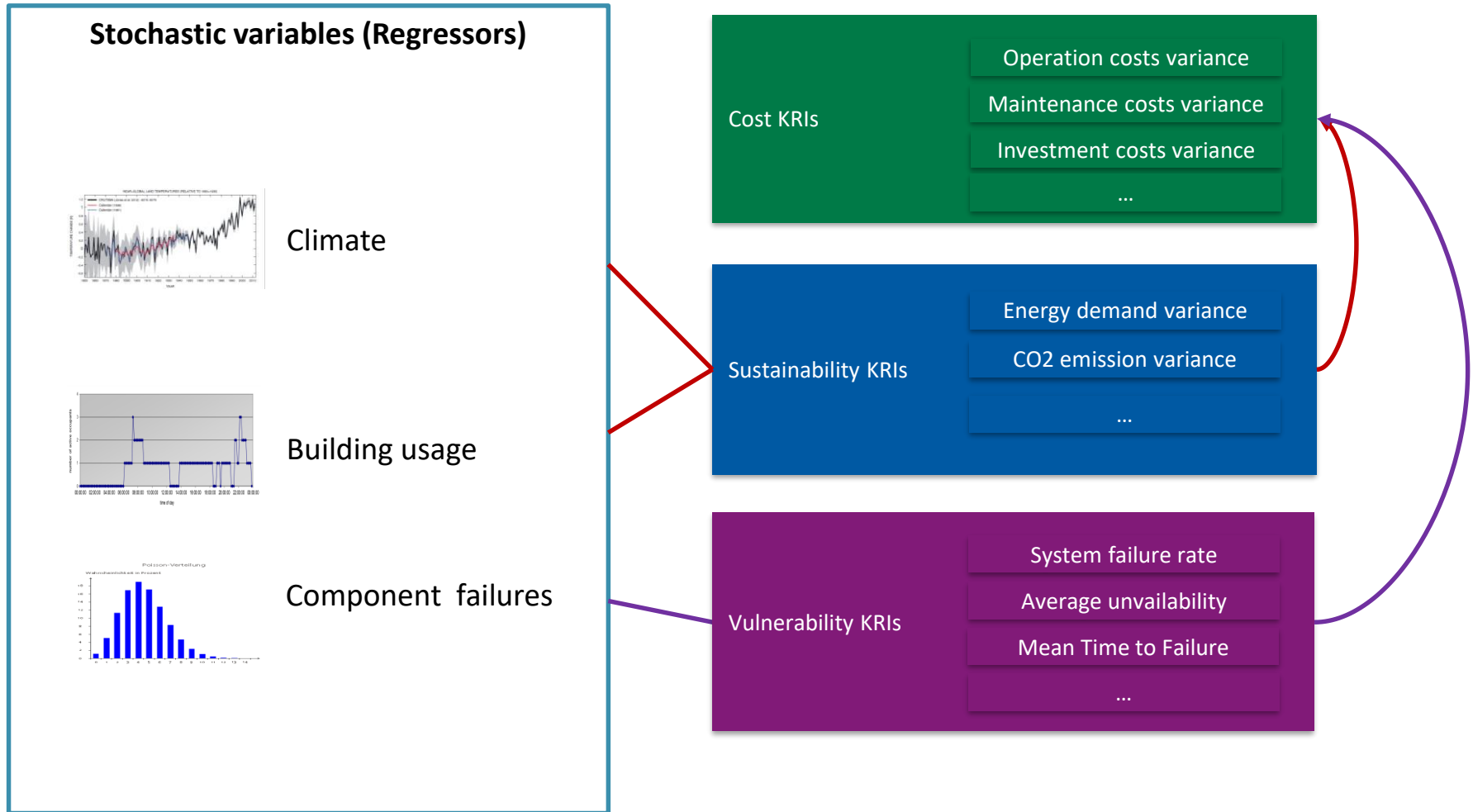
Data from other application models: **product templates, district energy system model, etc.**





- Some application models are associated with uncertainty: e.g. occupancy model, climate model, energy system...
- Sampling-based approach applicable with existing market solvers (e.g. TRNSYS, EnergyPlus...)
- Stochastic variables transformed into a set of sample values included into MMC





Occupancy modelling for energy simulation:

- Occupants interact with the energy system in two ways, indirectly by emitting heat, and directly by interacting with the energy system or energy relevant appliances (e.g. light switches)
- Foundation for both is the presence of the occupant

Method: 1st order Markov Chain (Richardson et al., 2008)

- Simulates number of present/active occupants per zone
- Differentiates between zone types (e.g. kitchen, bureau, ...) and day types (e.g. weekday, weekend)
- Flexible modelling and fast computation time

*Sampling service:*

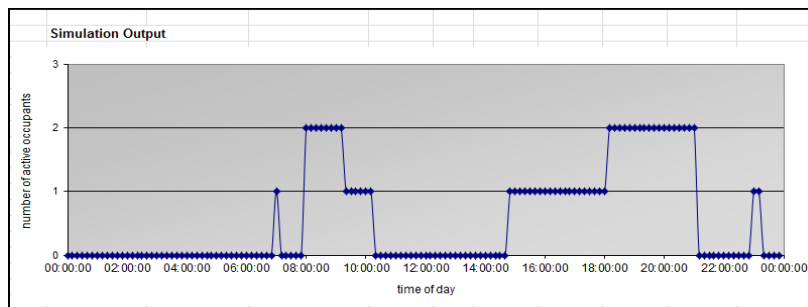
Occupancy data (room types and max nb of occupants) preliminary linked with IFC model in MMC

 Use of "transition probability matrices"

 Generation of samples (time series of occupant numbers)

Data generated by sampling for occupancy:

- From each transition matrix, an arbitrary number of samples can be generated
  - Time series representation:



Graphical representation of 1 sample of occupant numbers

- Tabular representation for further usage in energy simulation tools:

	Time.stamp	Occupancy.density.1	Occupancy.density.2	Occupancy.density.3	Occupancy.density.4
97	16.000	0.15	0.10	0.10	0.00
98	16.167	0.15	0.15	0.15	0.00
99	16.333	0.15	0.15	0.15	0.00
100	16.500	0.10	0.15	0.15	0.00
101	16.667	0.10	0.15	0.15	0.00
102	16.833	0.10	0.15	0.15	0.00
103	17.000	0.10	0.15	0.15	0.00
104	17.167	0.10	0.15	0.20	0.00
105	17.333	0.15	0.15	0.20	0.00
106	17.500	0.15	0.15	0.20	0.10
107	17.667	0.15	0.20	0.25	0.10
108	17.833	0.15	0.20	0.25	0.10
109	18.000	0.15	0.15	0.25	0.15
110	18.167	0.15	0.15	0.25	0.15
111	18.333	0.15	0.10	0.25	0.10
112	18.500	0.20	0.10	0.25	0.00
113	18.667	0.20	0.10	0.25	0.00
114	18.833	0.20	0.10	0.25	0.00
115	19.000	0.15	0.10	0.25	0.00

Example of 4 samples with 10 minute time step and occupancy density (occupant/m<sup>2</sup>)

- For enhanced accuracy, the climate data samples are real weather data records from the past that are formatted in the weather data format TRY.

```

Reihenfolge der Parameter:
RG TRY-Region                                {1..15}
IS Standortinformation                        {1,2}
MM Monat                                     {1..12}
DD Tag                                       {1..28,30,31}
HH Stunde (MEZ)                             {1..24}
N Bedeckungsgrad                            [Achtel] {0..8;9}
WR Windrichtung in 10 m Höhe über Grund     [°]       {0;10..360;999}
WG Windgeschwindigkeit in 10 m Höhe über Grund [m/s]
t Lufttemperatur in 2m Höhe über Grund      [°C]
p Luftdruck in Stationshöhe                 [hPa]
x Wasserdampfgehalt, Mischungsverhältnis    [g/kg]
RF Relative Feuchte in 2 m Höhe über Grund   [%]       {1..100}
W Wetterereignis der aktuellen Stunde       {0..99}
B Direkte Sonnenbestrahlungsstärke (horiz. Ebene) [W/m²] abwärts gerichtet: positiv
D Difuse Sonnenbestrahlungsstärke (horiz. Ebene) [W/m²] abwärts gerichtet: positiv
IK Information, ob B und oder D Messwert/Rechenwert {1;2;3;4;9}
A Bestrahlungsstärke d. atm. Wärmestrahlung (horiz. Ebene) [W/m²] abwärts gerichtet: positiv
E Bestrahlungsstärke d. terr. Wärmestrahlung [W/m²] aufwärts gerichtet: negativ
IL Qualitätsbit für die langwelligigen Strahlungsgrößen {1;2;3;4;5;6;7;8;9}

```

Variables:

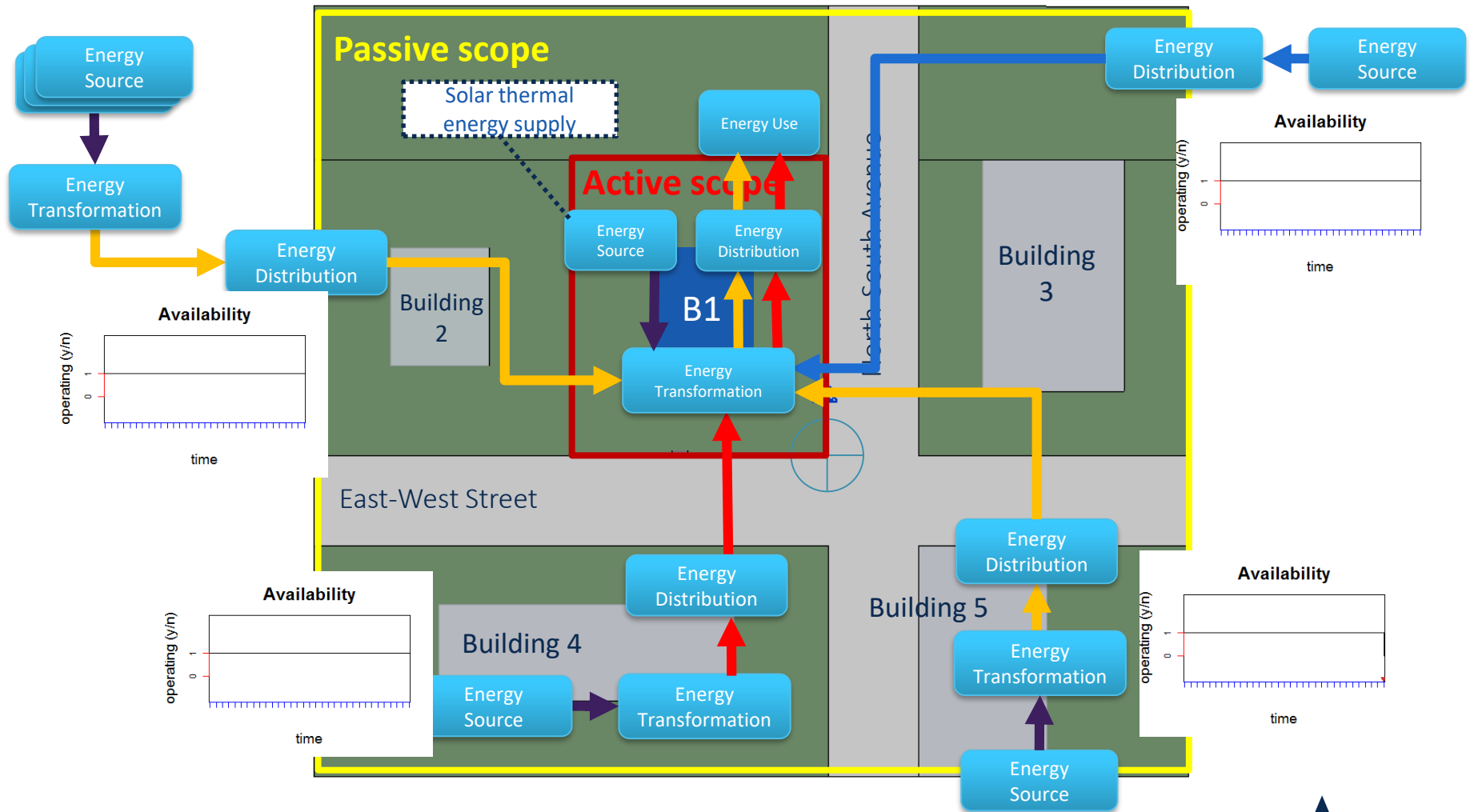
- Outdoor temperature
- Wind speed
- Wind direction
- Humidity
- Solar radiation
- Etc..

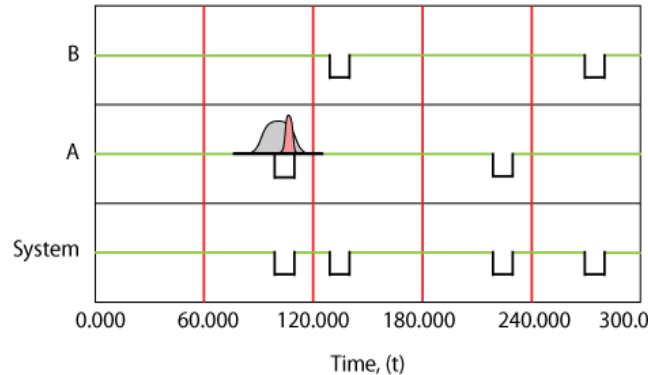
```

RG IS MM DD HH N WR WG t p x RF W B D IK A E IL
***
9 1 1 1 1 3 200 3.1 -3.6 969.1 2.3 77 -1 0 0 9 206 -285 9
9 1 1 1 2 1 160 2.4 -4.8 966.6 2.2 80 -1 0 0 9 206 -285 9
9 1 1 1 3 0 160 2.4 -5.8 964.5 2.0 78 -1 0 0 9 204 -283 9
9 1 1 1 4 1 190 2.2 -5.7 963.8 2.0 78 -1 0 0 9 207 -286 9
9 1 1 1 5 2 130 2.5 -5.7 963.0 1.8 70 -1 0 0 9 202 -280 9
9 1 1 1 6 4 170 2.0 -5.0 962.2 1.7 62 -1 0 0 9 216 -288 9
9 1 1 1 7 5 160 3.0 -5.2 961.5 1.6 60 -1 0 0 9 221 -287 9
9 1 1 1 8 6 170 3.0 -3.5 961.0 1.8 59 -1 0 0 9 223 -294 9
9 1 1 1 9 7 180 5.0 -2.7 960.5 1.9 59 -1 6 36 9 249 -300 9
9 1 1 1 10 7 190 5.0 -0.9 959.9 1.7 46 -1 11 75 9 239 -306 9
9 1 1 1 11 6 160 7.0 -0.3 959.2 1.8 46 -1 97 78 9 238 -309 9
9 1 1 1 12 6 170 6.0 1.2 958.1 1.6 37 -1 106 97 9 249 -316 9

```

Example of weather data time series in the TRY format. Data for Chemnitz, Germany, retrieved from DWD (Deutscher Wetterdienst)





Top/Down curves expressed as a set time series embedded in the Multimodel Container and linked to related ES components:

time	Energy system component failures					time	Energy system failures
	Component A	Component B	Component C	...	component N		
instant 0	1	1	1	...	1	instant 0	1
instant 1	1	0	1	...	1	instant 1	1
instant 2	1	1	1	...	1	instant 2	1
...	0	1	1	...	1	...	0
...	1	1	1	...	1	...	1
...	1	1	0	...	1	...	1
...	1	1	1	...	0	...	0
...	1	1	1	...	1	...	1
...	1	0	1	...	1	...	1
...	1	1	1	...	1	...	1
...	0	1	1	...	0	...	0
instant n	1	0	1	...	1	instant n	1

# Data variation model example for energy simulation in early design

```

1 <?xml version="1.0" encoding="ASCII" ?>
2 <VM:dataVariationModel xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance" xmlns:VM="http://www.cib.tu-dresden.de/DataVariationModel" analysis="uncertainty analysis" domain="energy simulation" id="EnergyAA1">
3   <VM:scope id="dc15fa41-c409-4725-a6d0-2e8bddadebac" scale="building"/>
4   <VM:variables>
5     <VM:variable designation="LinkModel" id="855fb49a-3e6a-487b-a117-3796ddf96829" IDref="Null" resourceURI="../../links/*.xml"/>
6     <VM:variable xsi:type="VM:ObjectProperty" designation="ClimateModel" domain="climate" id="5200d766-656b-4a47-ab91-63de27e2d8bf"><VM:relatedObject idref="1o1vYcpcH5KRRR15voLOXK"/></VM:variable>
7     <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="f3591cc8-b9e4-47b4-99ad-ed35eccf18bc"><VM:relatedObject idref="0hz2F785TEVRvFgZBLyPYD"/></VM:variable>
8     <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="ffb1836f-98c7-4edb-9c2b-e6056aaec83a"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXAR"/></VM:variable>
9     <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="c0121b47-c7e4-4621-9389-c3290e1alb04"><VM:relatedObject idref="0WXkncI4nX1CgNwla$GeCUV"/></VM:variable>
10    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="8f9d7760-1bd8-4407-8364-8dd6d463e0c8"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXAU"/></VM:variable>
11    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="7ccbe3c9-5a53-4ab2-ac49-a8d30a61fe56"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXHT"/></VM:variable>
12    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="9456de9c-5022-4da9-bffc-68b97b0f14cd"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXAL"/></VM:variable>
13    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="59e48776-c2d8-4800-9e00-768ea9f40ac8"><VM:relatedObject idref="0WXkncI4nX1CgNwla$GeCFA"/></VM:variable>
14    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="739f3d8e-5983-41cd-b24b-78a780b93873"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXbf"/></VM:variable>
15    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="2e586e8d-efbc-4782-933d-0897f60cdc83"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXHh"/></VM:variable>
16    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="cc0a2e79-c7f1-4951-9c42-2a3c05629b7b"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXas"/></VM:variable>
17    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="fb30fffa-98e8-4773-b650-4d60a1415584"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXak"/></VM:variable>
18    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="ab380b4e-1ff9-48e1-8162-06798565c883"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXbc"/></VM:variable>
19    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="d26431c3-87a8-4296-8b14-0b7b0eae7349"><VM:relatedObject idref="26431c3-87a8-4296-8b14-0b7b0eae7349"/></VM:variable>
20    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="630fbc6e-85ae-46c6-bc39-83322be82100"><VM:relatedObject idref="0WXkncI4nX1CgNwla$GeCU2"/></VM:variable>
21    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="cc388e6e-0ef5-46d0-98a4-75b7c7814e91"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXav"/></VM:variable>
22    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="1456364b-d10a-4f5e-8be4-907eb19c919"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXay"/></VM:variable>
23    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="8098e806-bc6f-4eeb-8a4a-07e67ab9dfe2"><VM:relatedObject idref="1HHL8Ca8L4N8YcXgILNXbi"/></VM:variable>
24    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="1c60924b-4d4e-ac2a-b5ab-a97d502e38ad"><VM:relatedObject idref="2Gwap3eTLAR84McnfgUoZL"/></VM:variable>
25    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="6d213a9f-10e2-456a-9ff0-17d205b6687"><VM:relatedObject idref="2Gwap3eTLAR84McnfgUoZM"/></VM:variable>
26    <VM:variable xsi:type="VM:ObjectProperty" designation="OccupancyModel" domain="occupancy" id="c477f141d-1193-4d7e-ad39-dcd211c5c728"><VM:relatedObject idref="2Gwap3eTLAR84McnfgUoZB"/></VM:variable>
27 </VM:variables>
28 <VM:variants>
29 <VM:variant description="" name="AZV1" type="design variant" variantID="f960e9ba-9df8-4358-a045-7c7c94318ca4">
30 <VM:variationByURI id="linkvariant0" variableID="855fb49a-3e6a-487b-a117-3796ddf96829">../../links/AZV1.xml</VM:variationByURI>
31 </VM:variant>
32 <VM:variant description="" name="ALV1" type="design variant" variantID="8c5502f1-a64a-492a-b43e-17dc3ed100e3">
33 <VM:variationByURI id="linkvariant1" variableID="855fb49a-3e6a-487b-a117-3796ddf96829">../../links/ALV1.xml</VM:variationByURI>
34 </VM:variant>
35 <VM:variant description="" name="ALV2" type="design variant" variantID="bf6a489f-1863-48df-8987-aal1774ac9da2">
36 <VM:variationByURI id="linkvariant2" variableID="855fb49a-3e6a-487b-a117-3796ddf96829">../../links/ALV2.xml</VM:variationByURI>
37 </VM:variant>
38 <VM:variant baselineVariantID="f960e9ba-9df8-4358-a045-7c7c94318ca4" sampleIndex="1" type="stochastic realization" variantID="f960e9ba-9df8-4358-a045-7c7c94318ca4_st0">
39 <VM:variationByURI domain="climate" id="aa8d35e-623e-4523-869c-777894d93cd4" variableID="5200d766-656b-4a47-ab91-63de27e2d8bf">../../models/samples/climate_2.dat</VM:variationByURI>
40 <VM:variationByURI domain="occupancy" id="23e4187e-a144-4ad8-944f-084a92e7952d" variableID="f3591cc8-b9e4-47b4-99ad-ed35eccf18bc">../../models/samples/occupancy_1_1.dat</VM:variationByURI>
41 <VM:variationByURI domain="occupancy" id="1629111ba-1b42-4aee-8ec2-380a3f78b373" variableID="ffb1836f-98c7-4edb-9c2b-e6056aaec83a">../../models/samples/occupancy_2_1.dat</VM:variationByURI>
42 <VM:variationByURI domain="occupancy" id="3110a391-d0b2-42f2-b668-9f9425eba808" variableID="c0121b47-c7e4-4621-9389-c3290e1alb04">../../models/samples/occupancy_3_1.dat</VM:variationByURI>
43 <VM:variationByURI domain="occupancy" id="ccide837-14f1-41c4-bec1-51019857287a" variableID="8f9d7760-1bd8-4407-8364-8dd6d463e0c8">../../models/samples/occupancy_4_1.dat</VM:variationByURI>
44 <VM:variationByURI domain="occupancy" id="72c283ee-6f66-4d55-a81e-f1414561c47" variableID="7ccbe3c9-5a53-4ab2-ac49-a8d30a61fe56">../../models/samples/occupancy_5_1.dat</VM:variationByURI>
45 <VM:variationByURI domain="occupancy" id="4ca9a806b-1723-41ee-b370-88b700b06324" variableID="9456de9c-5022-4da9-bffc-68b97b0f14cd">../../models/samples/occupancy_6_1.dat</VM:variationByURI>
46 <VM:variationByURI domain="occupancy" id="4d6df5b6d-d70-41e3-b374-b264-4296ce6a7bc9" variableID="59e48776-c2d8-4800-9e00-768ea9f40ac8">../../models/samples/occupancy_7_1.dat</VM:variationByURI>
47 <VM:variationByURI domain="occupancy" id="afic61df-1ae9-4c38-9fb7-363bc3340e9e" variableID="739f3d8e-5983-41cd-b24b-78a780b93873">../../models/samples/occupancy_8_1.dat</VM:variationByURI>
48 <VM:variationByURI domain="occupancy" id="1b1de590-2347-495e-acd9-212eb9f37868" variableID="2e586e8d-efbc-4782-933d-0897f60cdc83">../../models/samples/occupancy_9_1.dat</VM:variationByURI>
49 <VM:variationByURI domain="occupancy" id="8e32e7b3-9a30-4d38-8f21-6432841a9869" variableID="cc0a2e79-c7f1-4951-9c42-2a3c05629b7b">../../models/samples/occupancy_10_1.dat</VM:variationByURI>
50 <VM:variationByURI domain="occupancy" id="5ac1c28e-b2c5-4bea-a710-5459e0b388b0" variableID="fb30fffa-98e8-4773-b650-4d60a1415584">../../models/samples/occupancy_11_1.dat</VM:variationByURI>
51 <VM:variationByURI domain="occupancy" id="cdda9f5a8-96ec-47d9-890f-b37017f558a0" variableID="ab380b4e-1ff9-48e1-8162-06798565c883">../../models/samples/occupancy_12_1.dat</VM:variationByURI>
52 <VM:variationByURI domain="occupancy" id="7f198e6-11af-4936-a13a-aal6935cceb5" variableID="d26431c3-87a8-4296-8b14-0b7b0eae7349">../../models/samples/occupancy_13_1.dat</VM:variationByURI>
53 <VM:variationByURI domain="occupancy" id="9153bc99-11b1-476f-b96f-182c25085c5f" variableID="d26431c3-87a8-4296-8b14-0b7b0eae7349">../../models/samples/occupancy_14_1.dat</VM:variationByURI>
54 <VM:variationByURI domain="occupancy" id="88f7536f-d7ac-465f-ba05-f81113fc977d" variableID="cc388e6e-0ef5-46d0-98a4-75b7c7814e91">../../models/samples/occupancy_15_1.dat</VM:variationByURI>
55 </VM:variant>
56 <VM:variant baselineVariantID="f960e9ba-9df8-4358-a045-7c7c94318ca4" sampleIndex="2" type="stochastic realization" variantID="f960e9ba-9df8-4358-a045-7c7c94318ca4_st2">
57 <VM:variant baselineVariantID="f960e9ba-9df8-4358-a045-7c7c94318ca4" sampleIndex="3" type="stochastic realization" variantID="f960e9ba-9df8-4358-a045-7c7c94318ca4_st3">
58 <VM:variant baselineVariantID="8c5502f1-a64a-492a-b43e-17dc3ed100e3" sampleIndex="4" type="stochastic realization" variantID="8c5502f1-a64a-492a-b43e-17dc3ed100e3_st1">
59 <VM:variant baselineVariantID="8c5502f1-a64a-492a-b43e-17dc3ed100e3" sampleIndex="5" type="stochastic realization" variantID="8c5502f1-a64a-492a-b43e-17dc3ed100e3_st2">

```



3 design variants

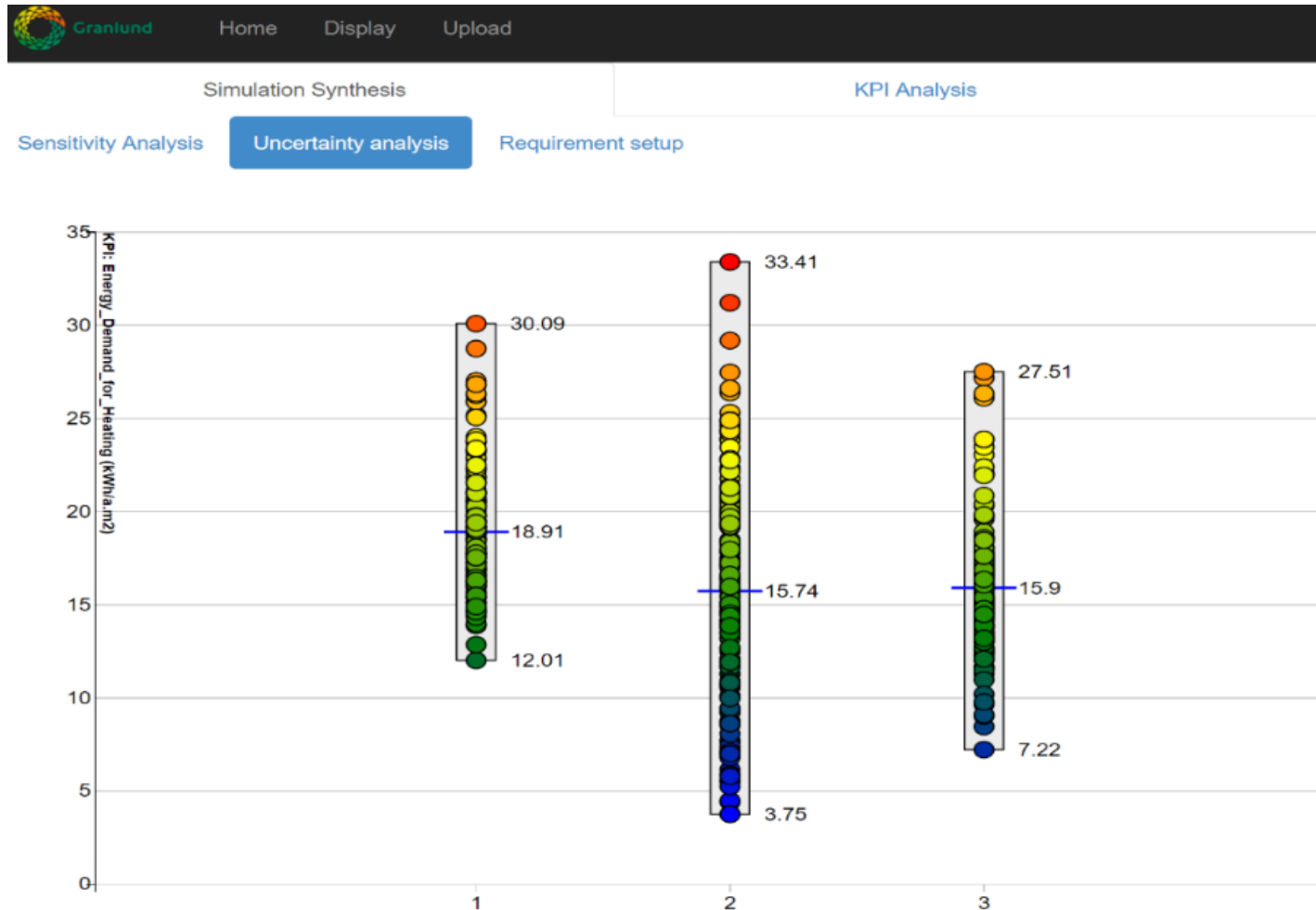
Related IFC-GUID (one IFCBuilding and 20 IFCRoom entities)

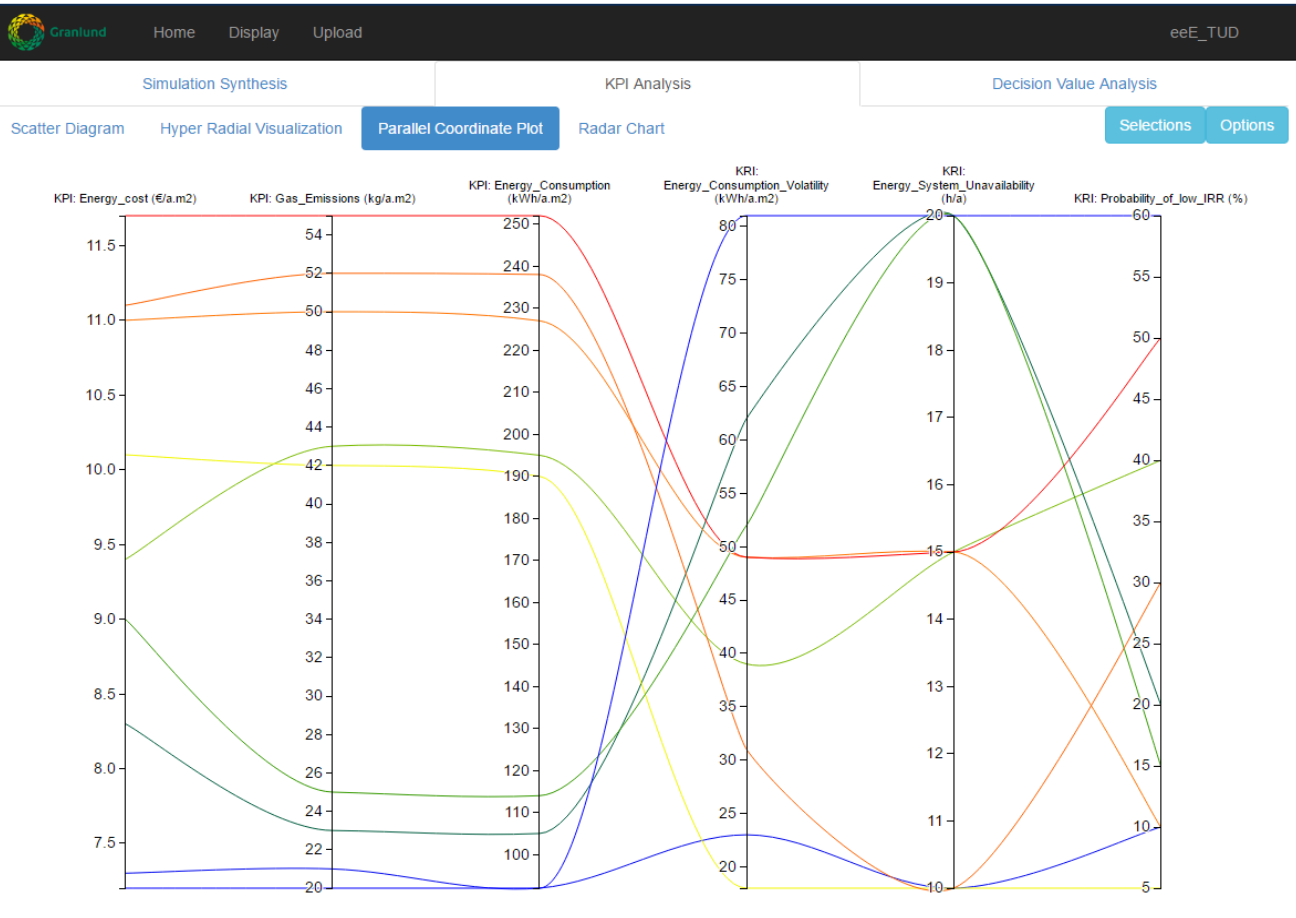
1st sample  
1 Climate  
+  
20 occupancy  
time series

n-samples

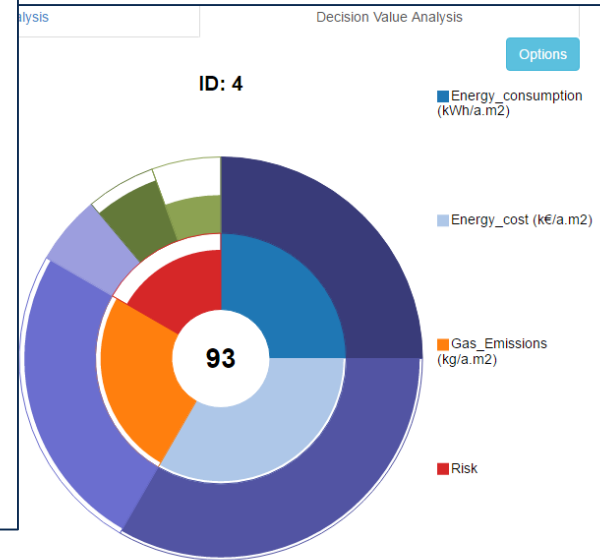


- Visualization of simulation results in term of energy demand for heating by three different design variants (Granlund Optimizer)

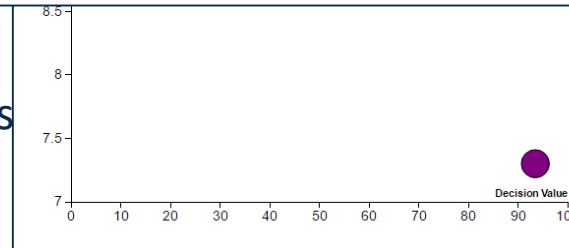




## Vizualisation in KPA Tool from Granlund



Weighting and normalization of KRIs for assessing compliance of actual risk level against risk appetite



- Conclusion:
  - multimodel method extended to fasten and facilitate setting and simulation of a large amount of variants and uncertainties in a collaborative building design workflow.
  - Method adapted for assessing uncertainty on the basis of standard simulation tools
  - Generic variation model was developed for describing stochastic realizations of BIM data as well as several types of design alternatives
  
- Future works:
  - Encompass more simulation domains e.g. structural analysis, reliability analysis, life cycle cost...
  - Apply for sensitivity analysis
  - Couple with cloud-computing technologies

Thank you for your attention