# An Approach for the Time-Dependent Thermoeconomic Modeling and Optimization of Energy System Synthesis, Design and Operation Part II: Reliability and Availability 

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#### Abstract

Details of the reliability and availability aspects of the thermoeconomic methodology presented in Part I (Olsommer et al., 1999) are given here in Part II of our series of two articles. These system details cannot be forgotten, particularly if the superconfiguration envisioned offers the choice of several technologies for the same function (redundancy) or if there are guarantees of availability which must be met. An original method, which is an extension of the event space method, is presented here for automating the reliability and/or availability calculations of a repairable system chosen from a flexible structure of equipment in active and/or passive redundancy, connected in series and/or parallel. This methodology permits a more realistic evaluation of performance, flows and costs at both the structural (synthesis-design) and operational levels and leads, thus, to more rational decisions on system synthesis, design and operation. Results for the application of this methodology to a waste incineration cogeneration facility with a gas turbine topping cycle are given in Part I (Olsommer et al., 1999).


Keywords: reliability, availability, Markov chains, energy systems optimization

## 1. Introduction

When the reliability and/or the availability of a system must be enhanced or must meet a particular goal, it is common practice to place several key pieces of equipment in parallel (redundancy). Sometimes it is a matter of meeting a given heat demand to be delivered to a district heating network within a given period and with a minimal probability of not meeting the demand. Or it can be a matter of improving the productivity of a system. In both cases, these considera-
tions have an immediate impact on the costs of the system and on its multiple flows (materials, energy). Furthermore, as soon as one admits that a piece of equipment is not perfectly reliable such considerations should be taken into account in a thermoeconomic analysis and/or optimization. In fact, when a system is composed of more than one piece of equipment (in series and/or in parallel), a comprehensive reliability and/or availability analysis must be completed if one wishes to calculate with accuracy the costs, the performance and the flows of the system.

In the context of simultaneously modeling and optimizing from a thermoeconomic standpoint the structure and operation of a system, there is a need for an automated procedure, which can deal with systems for which the structure changes (flexible) with time. Several methods which could be applicable to such an automated procedure have been developed (Villemeur, 1988). Of these the event space method (Roberts, 1964) is well suited for the reliability and availability analysis of repairable systems, taking into account all possible events of the system. The procedure can be easily implemented on a computer when the pieces of equipment are in active redundancy (i.e. no equipment is in stand-by ${ }^{1}$ ). The method involves constructing a so-called "Markov graph" or event space graph from which the reliability and/or availability can easily be deduced. Unfortunately, this automated procedure cannot be applied in a straightforward manner when in addition to active redundancy passive redundancy (i.e. a system including stand-by equipment) is considered. In this case, there are more than two possible events for each piece of equipment (actually six), leading, a priori, to a more complicated analysis with many more possible events ${ }^{2}$. The methodology developed here to overcome this difficulty (Olsommer, 1998) is presented below and permits use of a standard binary events-based Markov graph for repairable systems with active and/or passive redundancy. The algorithm, based on a set of rules, can easily be implemented on a computer.

We begin with a definition of important concepts of the reliability and availability theory.

## 2. Brief Background on Fundamentals

A system consists of several pieces of equipment placed in series and/or in parallel. Redundancy occurs when the equipment is in parallel. Depending on whether or not a piece of equipment is supposed to be in operation or in stand-by, redundancy is either active or passive, respectively.

### 2.1 Reliability, availability, maintainability

The reliability $R(t)$ (Eq. (1)) is measured by the probability that an entity E is able to accomplish its required function during a given period t. The availability $\mathrm{A}(\mathrm{t})$ (Eq. (2)) is measured by the probability that an entity E is able to accomplish its required function at a given time $t$. The maintainability $\mathrm{M}(\mathrm{t})$ (Eq. (3)) is measured by the

[^0]probability that the maintenance of an entity E is completed at a given time $t$, knowing that it had failed at time $t=0$. In equation form, these are given by
\[

$$
\begin{align*}
& R(t)=P[E \text { does not fail over }[0, t]]  \tag{1}\\
& A(t)=P[E \text { does not fail at time } t]  \tag{2}\\
& M(t)=P[E \text { is repaired over }[0, t]] \tag{3}
\end{align*}
$$
\]

### 2.2 Stochastic process and Markov chains

A stochastic process is a mathematical model which allows one to associate a random variable Q (representing here a system event) to a random variable T (representing here the time t ). Thus, the realization of event $Q$ at time $t$ is a function of the history (the trajectory of $\mathrm{Q}(\mathrm{t})$ ). A stochastic process is called Markov when the event $\mathrm{Q}\left(\mathrm{t}_{\mathrm{n}}\right)$ is fully determined by the preceding event $\mathrm{Q}\left(\mathrm{t}_{\mathrm{n}-1}\right)$. It is said that all the history is contained in the previous event. When all events of a Markov process are discrete, this process is called a Markov chain. This chain can be represented graphically as a Markov graph (or event space graph). The event space method (Roberts, 1964) relies on these two main assumptions: a Markov process in a discrete space.

### 2.3 Transition rates (failure and repair rates)

Transition rates express the probability of passing from a given event to another during the very next time period, knowing that the given event existed as such in the previous time period.

The failure rate $\lambda$ (Eq. (4)) is defined by the limit, provided it exists, of the ratio between the conditional probability that the failure instance of an entity is included in a given time interval [ t , $t+\Delta t]$ and the time interval when $\Delta t \rightarrow 0$. This assumes that the entity has not had a failure over $[0, t]$. In equation form, this is expressed as

$$
\begin{align*}
\lambda(\mathrm{t})=\lim _{\Delta \mathrm{t} \rightarrow 0} \frac{1}{\Delta \mathrm{t}} \quad \mathrm{P} & {[\mathrm{E} \text { fails between }[\mathrm{t}, \mathrm{t}+\Delta \mathrm{t}],} \\
& \text { knowing that it has not had } \\
& \text { any failure over }[0, \mathrm{t}]] \tag{4}
\end{align*}
$$

With the help of the conditional probabilities theorem, it can be easily shown that the failure rate can be expressed as a function of the reliability as follows:

$$
\begin{equation*}
\lambda(\mathrm{t})=\lim _{\Delta \mathrm{t} \rightarrow 0} \frac{\mathrm{R}(\mathrm{t})-\mathrm{R}(\mathrm{t}+\Delta \mathrm{t})}{\Delta \mathrm{tR}(\mathrm{t})}=\frac{-\frac{\mathrm{dR}(\mathrm{t})}{\mathrm{dt}}}{\mathrm{R}(\mathrm{t})} \geq 0 \tag{5}
\end{equation*}
$$

The repair rate $\mu$ (Eq. (6)) is defined by the limit (if existing) as $\Delta t \rightarrow 0$ of the ratio between the conditional probability that the moment of completion of an entity's repair is included in a given time interval $[\mathrm{t}, \mathrm{t}+\Delta \mathrm{t}]$ and the time interval itself. This assumes that the entity has failed over $[0, \mathrm{t}]$. Thus,

$$
\begin{equation*}
\mu(t)=\lim _{\Delta t \rightarrow 0} \frac{1}{\Delta t} P[\text { E repaired between }[t, t+\Delta t] \tag{6}
\end{equation*}
$$

knowing that it has failed over [ $0, \mathrm{t}]$ ]
In a way similar to that for the failure rate, it can be shown that the repair rate takes the form

$$
\begin{equation*}
\mu(\mathrm{t})=\frac{\frac{\mathrm{dM}(\mathrm{t})}{\mathrm{dt}}}{1-\mathrm{M}(\mathrm{t})} \geq 0 \tag{7}
\end{equation*}
$$

In graphic form, the failure rate of a piece of equipment is traditionally represented by a curve with a tub shape (see Fig. 1), depicting three main periods of its lifetime. They are (i) the early period marked by an initial abrupt decrease in failure rate (early failures); (ii) the useful lifetime period denoted by a constant failure rate; and (iii) the end of life period marked by an abrupt increase in the failure rate (wear). When a quasi-stationary approximation is used (see Part I; Olsommer et al., 1999), the curve of Fig. 1 can easily be decomposed into several mean constant values.


Figure 1. Time dependence of failure rate.
With the preceding definitions, the reliability and availability of a piece of equipment can be treated provided the following parameters are known:

- operating failure rate $(\lambda)$;
- start-up failure rate ( $\gamma$ );
- $\quad$ stopped failure rate $\left(\lambda_{s}\right)$;
- repair rate $(\mu)$.

TABLE I. TRANSITION RATE ESTIMATORS.

| Estimator | Note |
| :--- | :--- |
| $\hat{\lambda}=\mathrm{N}_{\mathrm{f}} / \mathrm{T}_{\mathrm{f}}$ | $\mathrm{N}_{\mathrm{f}}=$number of failures observed <br> while operating <br> cumulative operating time <br> $\hat{\gamma}=\mathrm{N}_{\mathrm{d}} / \mathrm{N}_{\mathrm{s}}$ |
| $\mathrm{N}_{\mathrm{f}}=$number of failures observed <br> at start-up <br> $\mathrm{N}_{\mathrm{s}}=$ number of start-ups |  |
| $\hat{\mu}=\mathrm{N}_{\mathrm{r}} / \mathrm{T}_{\mathrm{r}}$ | $\mathrm{N}_{\mathrm{r}}=$ number of repairs <br> $\mathrm{T}_{\mathrm{r}}=$ <br> cumulative repair time |

Note that the stopped failure rate can usually be neglected (i.e. $\lambda_{\mathrm{s}}=0$ ). Estimators for the parameters listed above are given in TABLE I. Their values can be found in the literature (e.g., Procaccia and Aufort, 1995).

## 3. Event Space Method for Systems with Active Redundancy

Let a system be composed of a set of $K$ components, placed in series and/or active redundancy. Each component has two possible events (operation (0) and breakdown (1)). Thus, the number of possible events is $2^{\mathrm{K}}$. The transition rates between each event are functions of the transition rates $(\lambda, \mu)$. This information can be depicted in a Markov graph (see Fig. 2). Each cell represents an event and is named a summit (V), while each arrow represents a transition rate and is named an edge $(\rightarrow)$. Events are grouped in columns defined by the number of broken-down pieces of equipment (e.g., the middle column has one broken-down piece of equipment while those to the left and right have zero and two, respectively). Thus the Markov graph of a system of $K$ components is made of $K$ +1 columns (see Fig. 2). It is important to note that there is no edge between event " 1 " (00) and "4" (11) since the probability of having two transitions at a time is of magnitude $\mathrm{dt}^{2}$ and can be neglected (Pagès and Gondran, 1980).


Figure 2. Markov graph for availability analysis of a system with two repairable pieces of equipment ( $1=$ operation, $0=$ breakdown). ${ }^{3}$

### 3.1 System's state equations

Let $\mathrm{a}_{\mathrm{ij}}$ be the transition rate between events i and j . In order to calculate the probability $\mathrm{P}_{\mathrm{i}}(\mathrm{t}+\mathrm{dt})$ of an event i at time $(\mathrm{t}+\mathrm{dt})$, there are two possibilities:
(i) If the system was in event i at time t , it must have stayed in that event. The associated probability is given by

[^1]\[

$$
\begin{equation*}
1-\sum_{\mathrm{j} \neq \mathrm{i}}^{\mathrm{I}} \mathrm{a}_{\mathrm{ij}} \mathrm{dt} \tag{8}
\end{equation*}
$$

\]

(ii) If the system was in event j at time t , then the transition inevitably occurred. The probability is

$$
\begin{equation*}
\mathrm{a}_{\mathrm{ji}} \mathrm{dt} \tag{9}
\end{equation*}
$$

Thus, the probability $\mathrm{P}_{\mathrm{i}}(\mathrm{t}+\mathrm{dt})$ can be expressed as the sum of the possible probabilities given above, i.e.

$$
\begin{align*}
& \mathrm{P}_{\mathrm{i}}(\mathrm{t}+\mathrm{dt})= \mathrm{P}[\text { the system is in } \mathrm{i} \text { at }(\mathrm{t}) \\
&\text { and stays in } \mathrm{i} \text { at }(\mathrm{t}+\mathrm{dt})]+ \\
& \sum_{\mathrm{j} \neq \mathrm{i}}^{\mathrm{I}} \mathrm{P}[\text { the system is in } \mathrm{j} \text { at }(\mathrm{t}) \\
&\text { and in } \mathrm{i} \text { at }(\mathrm{t}+\mathrm{dt})] \tag{10}
\end{align*}
$$

By setting $\mathrm{a}_{\mathrm{ii}}=-\sum_{\mathrm{j} \neq \mathrm{i}}^{\mathrm{I}} \mathrm{a}_{\mathrm{ij}}$, the system's state equations become

$$
\begin{equation*}
\frac{\mathrm{dP}_{\mathrm{i}}(\mathrm{t})}{\mathrm{dt}}=\sum_{\mathrm{j}=1}^{\mathrm{I}} \mathrm{P}_{\mathrm{j}}(\mathrm{t}) \mathrm{a}_{\mathrm{ji}} \quad \forall \mathrm{i}=1,2, . ., \mathrm{I} \tag{11}
\end{equation*}
$$

When initial conditions are known and $\mathrm{a}_{\mathrm{ji}}$ are fixed values, the system of equations (Eq. (11)) can be integrated. Each function is formed by an unsteady component and by a stationary component. In practice, the unsteady component tends rapidly towards zero and the system thus tends towards the stationary solution denoted by $\mathrm{P}_{\mathrm{i}}(\infty)$. In this case, Eq. (11) can be reduced to a homogenous system of equations, i.e.

$$
\begin{equation*}
\sum_{\mathrm{j}=1}^{\mathrm{I}} \mathrm{P}_{\mathrm{j}}(\infty) \mathrm{a}_{\mathrm{ji}}=0 \quad \forall \mathrm{i}=1, . ., \mathrm{I} \tag{12}
\end{equation*}
$$

This system can easily be solved by any linear algebra algorithm, taking into account the additional condition that

$$
\begin{equation*}
\sum_{\mathrm{j}=1}^{\mathrm{I}} \mathrm{P}_{\mathrm{j}}(\infty)=1 \tag{13}
\end{equation*}
$$

Laplace's method (Pagès and Gondran, 1980) allows one to express the solution of Eqs. (12) and (13) as the ratio of the determinant of the transition rate matrix ${ }^{4} \mathbf{A}$ (where except for line i which is replaced by a one, the last column is replaced by a column of zeros) to the determinant of $\mathbf{A}$ (where the last column is replaced by a column of ones). In equation form this is expressed as

[^2]
### 4.1 Problem definition

Let $N$ be the maximum number of pieces of equipment possible in the superconfiguration at time $t$. When all pieces of equipment are defined by an independent structural variable ${ }^{5}$, this number can be identified in the optimization procedure by inspecting the binary and integer components of vector $\mathbf{w}(1, \ldots, \boldsymbol{N})$ (see Part I; Olsommer et al., 1999). If $w_{n}=0$, the corres-ponding piece of equipment does not exist. A similar inspection of the binary components of the operational independent vector $\mathbf{x}(1, . ., \boldsymbol{N})$ permits one to determine if the corresponding piece of equipment is active or passive in the corresponding sequence. It is active if $x_{n}=1$ and passive if $x_{n}=0$. Thus, vector $\mathbf{w}$ determines the number $K$ of pieces of equipment effectively present and vector $\mathbf{x}$ their type of redundancy (active or passive).

In order to construct the Markov graph and its associated transition rate matrix $\mathbf{A}$, two separate parts of $\mathbf{A}$ will be considered: one for the failure analysis and the second for the repair analysis. Before proceeding, however, the following notation is adopted:

- the prefix "binary" or the subscript " ${ }_{\mathrm{B}}$ " will be added for active redundancy (event, table);
- the prefix "integer" or the subscript "E" will be added for passive redundancy (event, table).


### 4.2 Markov graph and transition rate matrix $A$ (failures):

The proposed algorithm consists of four main steps: (i) to construct the binary events table ( $\mathrm{F}_{\mathrm{B}}$ ) and to sort it; (ii) to construct the integer events table ( $\mathrm{F}_{\mathrm{E}}$ ) and the associated Markov graph; (iii) to construct the transition rate matrix (A); and (iv) to resolve possible conflicts which can occur in the construction of $\left(\mathrm{F}_{\mathrm{B}}\right)$. These steps are outlined below.

## (i) Binary events table:

Let K be the number of pieces of equipment. Thus, there are $\mathrm{I}=2^{\mathrm{K}}$ binary events. The binary events table $\mathrm{F}_{\mathrm{B}}$ (Eq. (15)) is obtained by:

- associating with each number $\mathrm{i} \in\{1, . ., \mathrm{I}\}$ (denoted \#D) the binary number ( $\ddot{y} y$ noteÿ̈̈\#B) equivalentn o $\mathrm{i}-1$ as well as H , the numprr eduiÿylent to the sum (bit by bit) of the corresponding binary number (\#B);
- sorting the table according to both criteria:

1. H decreasing;

[^3]2. \#D decreasing.
\[

$$
\begin{equation*}
\mathrm{F}_{\mathrm{B}}=\{\# \mathrm{D}, \# \mathrm{~B}, \mathrm{H}\} \tag{15}
\end{equation*}
$$

\]

where H will be named "number of ones". Note that event $\mathrm{i}=\mathrm{I}$, always has $\mathrm{H}=\mathrm{K}$ and that $\mathrm{F}_{\mathrm{B}}$ is fictive in the sense that it is only helpful to the calculus of the integer events table ( $\mathrm{F}_{\mathrm{E}}$ ). Note also that in Markov graphs, columns of events are composed of identical "number of ones" (H).

## (ii) Integer events table and the Markov graph:

The integer events table (Eq. (16)) is defined as a binary table in which binary events (\#B) are replaced by integer events (\#E), i.e.

$$
\begin{equation*}
\mathrm{F}_{\mathrm{E}}=\{\# \mathrm{D}, \# \mathrm{E}, \mathrm{H}\} \tag{16}
\end{equation*}
$$

where \#E is found by replacing each component (i.e. corresponding to each piece of equipment) of \#B by the corresponding integer event $\in\{0, . ., 5\}$ using the procedure described below.

For the failure graph, construction proceeds from left to right and by decreasing \#D. Based on the assumption that only one piece of equipment can breakdown at any one time (see above), a transition can only take place between two events for which the H of the event of origin is greater than the one for the summit event $\left(\mathrm{H}_{\text {origin }}>\mathrm{H}_{\text {summit }}\right)$. The method consists of skimming through $\mathrm{F}_{\mathrm{B}}$ from top to bottom and determining for each event of origin if one can connect it to each summit event meeting the above criterion $\left(\mathrm{H}_{\text {origin }}>\mathrm{H}_{\text {summit }}\right)$. If the answer is yes, the integer event of the summit has to be determined with the help of the set of rules described below (R.1-R.9). The binary and integer events can be denoted as a table $\mathrm{V}_{\mathrm{B}}$ and $\mathrm{V}_{\mathrm{E}}$, respectively, equal to the second column $\# \mathrm{~B}$ and \#E, respectively, in tables $F_{B}$ and $F_{E}$, respectively. For example, $\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})$ represents the integer event of the $k^{\text {th }}$ piece of equipment of the $i^{\text {th }}$ event. The rules needed to determine the integer event are as follow:

1. Event $\mathrm{i}=\mathrm{I}=2^{\mathrm{k}}$ : Is the corresponding piece of equipment $v$ in active or in passive redundancy? Apply rule R.1.

| For $k=1, . ., ~$ <br> if $x_{v}=1, ~ t h e n ~$ <br> $V_{E}$ <br> $(I, k)=1$ <br> if $x_{v}=0$, then $V_{E}(I, k)=3$ <br> (i.e. passive) | R. 1 |
| :--- | :--- |

2. For each event $i \leq I=2^{k}\left(V_{E}(i)\right)$ : For each event $j$ of $V_{B}(j)$ (with $k=1, \ldots, K$ ) meeting criterion $\mathrm{H}_{\text {origin }}>\mathrm{H}_{\text {summit, }}$, test if the couple ${ }^{6}$ $<V_{E}(i) \rightarrow V_{B}(j)>$ meets following criteria: a piece of equipment cannot return from a break-

[^4]down event to a operating event ${ }^{7}$; note that the number of transitions from operating events ( 1 or 5 in TABLE II) to breakdown events can not exceed 1. Apply rules (R.2a and R.2b).

| For $<\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k}) \rightarrow \mathrm{V}_{\mathrm{B}}(\mathrm{j}, \mathrm{k})>, \mathrm{k}=1, \ldots, \mathrm{~K}$, <br> there is no transition $<0 \rightarrow 1>$, <br> there is no transition $<2 \rightarrow 1>$, <br> there is no transition $<4 \rightarrow 1>$. | R.2a |
| :--- | :--- |
| For $<\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k}) \rightarrow \mathrm{V}_{\mathrm{B}}(\mathrm{j}, \mathrm{k})>, \mathrm{k}=1, \ldots, \mathrm{~K}$, <br> the number of transitions $<1 \rightarrow 0>$ <br> + the number of transitions $<5 \rightarrow 0>\leq 1$. | R.2b |

If rule R. 2 a or rule R. 2 b is violated, then there is no possibility of an edge between both events $\left\langle V_{E}(i) \rightarrow V_{B}(j)\right\rangle$. Thus, one must go to next event $j$ and start again. If both R.2a and R. 2 b are satisfied, then an edge can exist. In this case, begin with the calculation of the integer event of summit $\mathrm{V}_{\mathrm{B}}(\mathrm{j})$ of the couple $<V_{E}(\mathrm{i}) \rightarrow \mathrm{V}_{\mathrm{B}}(\mathrm{j})>$ as follows:
Calculation of $V_{E}(j, k)$ : For each $k=1, \ldots, K$ (i.e. for each piece of equipment) of the integer event of origin $\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})$, do the following:
a) If the equipment is active $\left(\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})=0\right.$ or 1 ), then the binary event of the summit $\mathrm{V}_{\mathrm{B}}(\mathrm{j}, \mathrm{k})$ is not modified (rule R.3).

| For $<V_{E}(i, k) \rightarrow V_{B}(j, k)>$ <br> if $V_{E}(i, k)=0$ or 1, then $V_{E}(j, k)=$ <br> $k)$. |
| :--- | :--- |

b) If the equipment is passive $\left(\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})=\right.$ $2,3,4$ or 5 ), then the integer event of the summit $\mathrm{V}_{\mathrm{B}}(\mathrm{j}, \mathrm{k})$ depends on both the integer event of origin $\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})$ and the emergency procedure. The latter is described as follows:
I. If equipment k is not engaged and is broken-down $\left(\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})=2\right)$, then it stays in the same event (rule R.4). Note that the transition $<2 \rightarrow 1>$ has already been eliminated by rule (R.2a).

| For $<V_{\mathrm{E}}(\mathrm{i}, \mathrm{k}) \rightarrow \mathrm{V}_{\mathrm{B}}(\mathrm{j}, \mathrm{k})>$ <br> if $\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})=2$, then $\mathrm{V}_{\mathrm{E}}(\mathrm{j}, \mathrm{k})=2$. | R. 4 |
| :--- | :--- |

II. If equipment $k$ has been engaged and has broken-down $\left(\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})=4\right)$, then it stays in the same event (rule R.5). Note that the transition $<4 \rightarrow 1>$ has already been eliminated by rule (R.2a).

| For $<V_{E}(i, k) \rightarrow V_{B}(j, k)>$, <br> if $V_{E}(i, k)=4$, then $V_{E}(j, k)=4$. | R. 5 |
| :--- | :--- |

[^5]III.If equipment $k$ has been engaged and has started $\left(\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})=5\right)$, then it can break down or stay in operation (rule R.6).

| For $<V_{E}(i, k) \rightarrow V_{B}(j, k)>$, <br> if $V_{E}(i, k)=5$ and $V_{B}(j, k)=0$, <br> then $V_{E}(j, k)=4$, |  |
| :--- | :--- |
| if $V_{E}(i, k)=5$ and $V_{B}(j, k)=1$, | R. 6 |
| then $V_{E}(j, k)=5$. |  |

IV.If equipment k is waiting and ready to operate $\left(\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k})=3\right)$, then look at the emergency procedure. If $k$ has been engaged, it can break down or start (rule R.7a). If it has not been engaged, it can break down or stay in readiness to operate (rule R.7b).

| For $<V_{E}(i, k) \rightarrow V_{B}(j, k)>$, <br> if $V_{E}(i, k)=3$ and equipment $j$ must be <br> engaged, <br> if $V_{B}(j, k)=0$, then $V_{E}(j, k)=4$, <br> if $V_{B}(j, k)=1$, then $V_{E}(j, k)=5$. |  |
| :---: | :---: | :---: |
| For $<V_{E}(i, k) \rightarrow V_{B}(j, k)>$, <br> if $V_{E}(i, k)=3$ and equipment $j$ has not <br> been engaged, <br> if $V_{B}(j, k)=0$, then $V_{E}(j, k)=2$, <br> if $V_{B}(j, k)=1$, then $V_{E}(j, k)=3$. |  |

At this point, $\mathrm{F}_{\mathrm{E}}$ and the failure Markov graph can be constructed. It still remains to calculate the weight (or transition rate) $\mathrm{a}_{\mathrm{ij}}$ of each edge and resolve possible conflicts.

## (iii) Transition rate matrix (A):

Assuming that the transition rates are independent of the event and based on the aforementioned assumptions, the contribution $\tau_{\mathrm{k}}$ for each possible transition is summarized in TABLE III. The weight of each edge is found by multiplying the K transition rate contributions as follows:

$$
\begin{equation*}
\mathrm{a}_{\mathrm{ij}}=\prod_{\mathrm{k}=1}^{\mathrm{K}} \tau_{\mathrm{k}} \tag{17}
\end{equation*}
$$

(iv) Possible conflicts:

In some cases, it is possible that the calculation of an integer event $\mathrm{V}_{\mathrm{E}}(\mathrm{j}, \mathrm{k})$ can lead to different values through different edges (ways). This happens sometimes with events $\mathrm{V}_{\mathrm{E}}(\mathrm{j}, \mathrm{k})=2$ and $\mathrm{V}_{\mathrm{E}}(\mathrm{j}, \mathrm{k})=4$. In this case, event $\mathrm{V}_{\mathrm{E}}(\mathrm{j}, \mathrm{k})=4$ supersedes the former (rule R.8). Note that it can easily be shown that this conflict does not affect the numerical results of the availability or reliability analysis at all, but only the Markov graph representation.

| For $<V_{E}(i, k) \rightarrow V_{E}(j, k)>, k=1, . ., k$ |
| :--- |
| if $V_{E}(j, k)=2$ or 4 differs from another |
| edge, | R. 8 .

then $\mathrm{V}_{\mathrm{E}}(\mathrm{j}, \mathrm{k})=4$
At this point, $\mathrm{F}_{\mathrm{E}}$, and both the failure Markov graph and $\mathbf{A}$ are fully defined. What remains is to complete the Markov graph and the transition rate matrix $\mathbf{A}$ for repairs.

TABLE III. TRANSITION RATE $\tau_{\mathrm{k}}$ FOR EACH TRANSITION.

| Transition <br> $<\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k}) \rightarrow \mathrm{V}_{\mathrm{E}}(\mathrm{j}, \mathrm{k})>$ | Transition rate <br> $\tau_{\mathrm{k}}$ |
| :---: | :---: |
| $<0 \rightarrow 0>$ | 1 |
| $<1 \rightarrow 0>$ | $\lambda_{\mathrm{k}}$ |
| $<1 \rightarrow 1>$ | 1 |
| $<2 \rightarrow 2>$ | 1 |
| $<2 \rightarrow 4>$ | 1 |
| $<3 \rightarrow 2>$ | 0 |
| $<3 \rightarrow 3>$ | 1 |
| $<3 \rightarrow 4>$ | $\gamma_{\mathrm{k}}$ |
| $<3 \rightarrow 5>$ | $1-\gamma_{\mathrm{k}}$ |
| $<4 \rightarrow 4>$ | 1 |
| $<5 \rightarrow 4>$ | $\lambda_{\mathrm{k}}$ |
| $<5 \rightarrow 5>$ | 1 |

### 4.3 Markov graph and transition rate matrix A (repairs):

Assuming that only one piece of equipment can be repaired at a time, the repair Markov graph can easily be built from the binary events table $\left(\mathrm{F}_{\mathrm{B}}\right)$ as follows:

For each event $\left(V_{B}(i)\right)$ : For each event $\mathrm{V}_{\mathrm{B}}(\mathrm{j})$, the couple $\left\langle\mathrm{V}_{\mathrm{B}}(\mathrm{i}) \rightarrow \mathrm{V}_{\mathrm{B}}(\mathrm{j})\right\rangle$ has an edge if the criterion $\mathrm{H}_{\text {origin }}<\mathrm{H}_{\text {summit }}$ is met and if one and only one piece of equipment of event $V_{B}(i)$ is repaired (rule R.9).


The weight of edge $\mathrm{a}_{\mathrm{ij}}$ is given by the repair rate $\left(\mu_{\mathrm{k}}\right)$ of the corresponding repaired piece of equipment, i.e.

$$
\begin{equation*}
\mathrm{a}_{\mathrm{ij}}=\mu_{\mathrm{k}} \tag{18}
\end{equation*}
$$

At this point, the Markov graph and $\mathbf{A}$ are fully defined. The asymptotic probabilities $\left(P_{i}(\infty), i=1, \ldots, I\right.$ with $\left.I=2^{K}\right)$ can easily be deduced through Eq. (14).

## 5. Exact Costs and Flows

Consider a system of order $K$ and assume that a quasi-stationary approximation can be
made and that the solution of Eq. (11) rapidly tends towards a stationary solution (asymptotic probabilities). Then, the exact costs and flows (materials, energy) are easily calculated by considering each event and weighting the cost or flow with the asymptotic probability $\mathrm{P}_{\mathrm{i}}(\infty)$ (Eqs (19) and (20)).

$$
\begin{align*}
& \dot{\Phi}_{\text {exact }}=\sum_{\mathrm{i}=1}^{\mathrm{I}=2^{K}} \mathrm{P}_{\mathrm{i}}(\infty) \dot{\Phi}_{\mathrm{i}}  \tag{19}\\
& \Phi_{\text {exact }}=\left(\sum_{\mathrm{i}=1}^{\mathrm{I}=2^{K}} \mathrm{P}_{\mathrm{i}}(\infty) \dot{\Phi}_{\mathrm{i}}\right) \Delta \mathrm{t} \tag{20}
\end{align*}
$$

6. Application: Influence of Availability Analysis on Thermoeconomics

Consider the availability analysis of the superconfiguration depicted in Fig. 1 appearing in Part I (Olsommer et al., 1999).

### 6.1 Problem definition

In addition to the aforementioned assumptions, the following assumptions are made:

- the $\mathrm{RH}, \mathrm{T} 1, \mathrm{~T} 2, \mathrm{C} 1, \mathrm{C} 2$ and DH are much more reliable than the F1, F2, F3, GT and AB (Procaccia and Aufort, 1995);
- the pumps (P) are already doubled or tripled and are, thus, perfectly reliable;
- the furnaces (F1, F2, F3) are always, when present, active pieces of equipment (i.e. they are much too expensive to be passive).
Thus, the availability depends only on the furnaces (F1, F2, F3), the gas turbine (GT) and the auxiliary boiler (AB).

The minimum availability limit on heat delivery to the district heating network $\left(\mathrm{A}_{\mathrm{DH}}\right)$ has been fixed at 99.9 (\%). Below this value, the objective function has been penalized (see TABLE V in Part I (Olsommer et al., 1999). The maximum operational load of the furnaces has been set at $110 \%$ and at $100 \%$ for the GT and AB. For sanitary and security reasons, the maximum storage period in the waste pit has been set to four days for each sequence, assuming that each furnace does not break down more than once per season (4 months; SAIOD, 1997).

For each sequence $(k=1, \ldots, K)$, the problem is defined by the structural vector $\mathbf{w}_{\mathrm{k}}=\left(\mathrm{w}_{\mathrm{F} 1}, \mathrm{w}_{\mathrm{F} 2}\right.$, $\left.\mathrm{w}_{\mathrm{F} 3}, \mathrm{w}_{\mathrm{GT}}, \mathrm{w}_{\mathrm{AB}}\right)_{\mathrm{k}}$ and the operational vector $\mathbf{x}_{\mathrm{k}}=$ $\left(\mathrm{x}_{\mathrm{F}}, \mathrm{x}_{\mathrm{F} 2}, \mathrm{x}_{\mathrm{F} 3}, \mathrm{x}_{\mathrm{GT}}, \mathrm{x}_{\mathrm{AB}}\right)_{\mathrm{k}}$. Note that based on the acquisition date of each piece of equipment, the structure of the system can vary with the sequence k (flexible structure in time). Transition rate estimators (see TABLE IV) have been assumed identical over each sequence.

TABLE IV. TRANSITIONRATEESTIMATORS
(Procaccia and Aufort, 1995; SAIOD, 1997).

| Equip- <br> ment | Operating failure <br> $\hat{\lambda}$ | Start-up failure <br> $\hat{\gamma}$ | Repair <br> $\hat{\mu}$ |
| :---: | :---: | :---: | :---: |
| F1,F2,F3 | $497 \mathrm{e}-6$ | $100 \mathrm{e}-3$ | $1 / 180$ |
| GT | $1400 \mathrm{e}-6$ | $15 \mathrm{e}-3$ | $1 / 21$ |
| AB | $220 \mathrm{e}-6$ | $5 \mathrm{e}-3$ | $1 / 82$ |

The emergency procedures can easily be implemented and are as follow:

- F1: If F2 or F3 or F2 and F3 are brokendown, then run F1 up to its maximum load.
- F2: If F1 or F3 or F1 and F3 are brokendown, then run F 2 up to its maximum load.
- F3: If F1 or F2 or F1 and F2 are brokendown, then run F3 up to its maximum load.
- GT: If F1, F2 and F3 are broken-down, then start the GT and run it up to its maximum load if it is waiting or let it operate at its chosen operating load if it is in operation.
- AB: If F1, F2 and F3 are broken-down and the GT is broken-down or has broken down when started, then start the $A B$ and run it up to its maximum load if it is waiting or let it operate at its chosen operating load if it is in operation.


### 6.2 Numerical results

Figure 3 shows the results of the influence of availability on the overall costs $\left(\mathrm{C}_{\mathrm{tpn}}\right)$ with respect to the number of furnaces in redundance. Although this particular example does not result from an optimization but a parametric sensitivity study, it illustrates quite well that without an availability analysis:

- the overall costs are far from their exact value;
- the optimal structure would not be the right one.


Figure 3. Influence of availability analysis and redundancy on the overall costs of a waste incineration power plant with cogeneration and $a$ topping-cycle.

Figures 4 and 5 show detailed results of the availability analysis for the global optimum solution of the application presented in Part I (Olsommer et al., 1999). This solution is composed of only one furnace (F1), the gas turbine (GT) and the auxiliary boiler (AB). Figures $4 a, b$ show the Markov graphs and their associated asymptotic probabilities for the optimal system of each sequence. Looking at Tables VIII, IX in Part I (Olsommer et al., 1999), it can easily be shown that the only event for which the heat demand cannot be fulfilled is the one when all the equipment is broken-down (event "1"). In both cases (see Fig. 4a,b), the DH availability constraint is never violated (Fig. $4 a: \mathrm{A}_{\mathrm{DH}}=1-$ $1.8 \mathrm{e}-5 \geq 0.999$; Fig. $4 b$ : $\mathrm{A}_{\mathrm{DH}}=1-4.1 \mathrm{e}-5 \geq 0.999$ ). Note that events "1" and " 2 " of Fig. $4 b$ represent the unavailability of a system composed only of the F1 and the GT in active redundancy. In this case, the constraints would have been violated (Fig. $4 b$ : $\left.\mathrm{A}_{\mathrm{DH}}=1-(4.1 \mathrm{e}-5+2.3 \mathrm{e}-3)<0.999\right)$. This explains why the optimization chose the configuration with at least three steam sources.

Figures $5 a, b$ show a comparison of the optimal costs at the structural and operational levels with and without availability analysis ${ }^{8}$. At the structural level, the costs $\left(\mathrm{C}_{\mathrm{tpn}}\right)$ are underestimated by more than $18 \mathrm{CHF} /$ ton. At the operational level, the error is between $5 \%$ and $10 \%$.

## 7. Conclusion

In the context of system integration, a comprehensive reliability and/or availability analysis leads to a more realistic evaluation of the performance, flows and costs of a given system by accounting for all possible intermediate events. The method developed and presented in this paper can be easily implemented on a computer and used in an optimization procedure. It permits one to treat systems with multiple events ( 6 in this case) with the number of mathematical operations identical to a procedure for a system with only two events. With realistic assumptions, this method can deal with complex systems with a flexible structure in time and composed of equipment placed in series and/or in parallel and in active and/or passive redundance.

Results show that the availability analysis has a significant influence on both structural and operational decisions and that neglecting such a comprehensive analysis can lead to important errors.

[^6]
(a) F1 and GT active, $A B$ in passive redundance (sequences 2,3,4,5,6,8,9, 11,12).

(b) F1, GT and $A B$ in active redundance (sequences 1,7,10).

Figure 4. Optimal solution: Markov graphs and asymptotic probabilities $\left(\Pi_{i}(\infty)\right)$ for each of the $K=12$ sequences of the application (see Part I (Olsommer et al., 1999)).

(a) Structural level (L1): objective function ( $C_{t p n}$ ).

(b) Operational level (L2): objective function ( $\dot{\mathrm{C}}_{\mathrm{k}}$ ).

Figure 5. Optimal solution: Influence of availability analysis on the costs.

| Nomenclature |  |  |
| :--- | :--- | :--- |
|  |  |  |
| A | availability |  |
| A | transition rate matrix |  |
| $\mathrm{a}_{\mathrm{ij}}$ | transition rate of matrix A |  |
| AB | auxiliary boiler |  |
| C | aero-condenser |  |
| C | cost |  |
| CHF | Swiss Franc |  |
| DH | heat exchanger for district heating |  |
| E | entity |  |
| F | furnace plus steam generator |  |
| $\mathrm{F}_{\mathrm{B}}$ | binary events table |  |
| $\mathrm{F}_{\mathrm{E}}$ | integer events table |  |
| GT | gas turbine |  |
| H | "number of ones" in \#B |  |
| $\mathrm{I}, \mathrm{i}$ | Number, index of event(s) |  |
| i | index for origin |  |
| j | index for summit |  |
| $\mathrm{K}, \mathrm{k}$ | number, index of sequence(s) |  |
| $\mathrm{K}, \mathrm{k}$ | number, index of equipment |  |
| M | mid-season |  |
| M | maintainability |  |
| N | maximum number of pieces of equip- |  |
|  | ment in the superconfiguration |  |


| P | probability(-) |
| :---: | :---: |
| Q | random variable |
| R | reliability |
| S | summer |
| T | turbine |
| t | time |
| V | summit, event |
| W | winter |
| w | structural (synthesis-design) independent variable set |
| x | operational independent variable set |
| \#B | binary representation of a binary event |
| \#D | decimal number |
| \#E | integer representation of an integer event |
| $\rightarrow$ | edge |

Greek Symbols

| $\dot{\Phi}, \Phi$ | flux, quantity |
| :--- | :--- |
| $\lambda$ | operating failure rate |
| $\lambda_{s}$ | stopped failure rate |
| $\gamma$ | start-up failure rate |
| $\mu$ | repair rate |
| $\tau$ | transition rate |

Subscripts and Superscripts

| B | binary |
| :--- | :--- |
| E | integer |
| tpn | total present net |
| $\wedge$ | estimator |

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[^0]:    ${ }^{1}$ Equipment engaged only in case of need.
    $26^{\mathrm{K}}$ events, with K the number of pieces of equipment.

[^1]:    ${ }^{3}$ Note that this graph can also be used for reliability analysis by noting (based on the definition of reliability) that the system cannot return from a breakdown event. If the breakdown event occur when both pieces of equipment are broken-down (event "1"), it follows that one has to suppress all edges emanating from event " 1 " (00).

[^2]:    ${ }^{4}$ Matrix of size IxI composed of the transition rates $\mathrm{a}_{\mathrm{ij}}$.

[^3]:    5 Note that each piece of equipment is not necessarily defined by a structural or operational independent variable.

[^4]:    ${ }^{6}$ Here, $\left\langle\mathrm{V}_{\mathrm{E}}(\mathrm{i}, \mathrm{k}) \rightarrow \mathrm{V}_{\mathrm{B}}(\mathrm{j}, \mathrm{k})>\right.$ has integer event $\mathrm{V}_{\mathrm{E}}$ for its origin and the binary event $V_{B}$ for its summit.

[^5]:    7 Note that at this point, only the failure graph has been considered. The repair graph will be treated below.

[^6]:    8 Note that the results without availability analysis are based on the same optimal independent structural and operational variable sets ( $\mathbf{w}, \mathbf{x}$ ) as those with availability analysis.

