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When Precedents Clash

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Abstract. Consistency of case bases is a way to avoid the problem of retrieving conflicting constraining precedents for new cases to be decided. However, in legal practice the consistency requirements for cases bases may not be satisfied. As pointed out in [6], a model of precedential constraint should take into account the hierarchical structure of the specific legal system under consideration and the temporal dimension of cases. This article continues the research initiated in [18,9], which established a connection between Boolean classifiers and legal case-based reasoning. On this basis, we enrich the classifier models with an organisational structure that takes into account both the hierarchy of courts and which courts issue decisions that are binding/constraining on subsequent cases. We focus on common law systems. We also introduce a temporal relation between cases. Within this enriched framework, we can formalise the notions of overruled cases and cases decided per incuriam: such cases are not to be considered binding on later cases. Finally, we show under which condition principles based on the hierarchical structure and on the temporal dimension can provide an unambiguous decision-making process for new cases in the presence of conflicting binding precedents.

Keywords. legal case-based reasoning, classifier model, conflict of precedents

1. Introduction

The use of machine learning (ML) to predict the outcomes of legal procedures is widely discussed in the literature, by legal experts and by policymakers (see, e.g., [11,20,4,2]). Specifically, some concerns are raised by judges regarding the use of AI in the courts. Firstly, AI can undermine the independent exercise of judicial power, Moreover, it is not established at all that the outcomes of judicial algorithmic decision predictors are normatively correct, accurate and robust. Finally, ML decision making is far from being transparent and explainable. To address these concerns, symbolic methods are needed to formally verify the robustness of machine learning algorithms used in predictive justice. ML algorithms in predictive justice provide the outcome of new cases on the basis of previous cases; in this sense they perform case base reasoning (CBR). And indeed, in [18], a correspondence between formal models of legal CBR and binary input classifier models (CMs) [17,16] has been established. In particular, the correspondence had been identified between specific CMs and the reason and result model proposed by Horty [13]. Horty's models aim to formalise a founding concept of the common law, that of precedential constraint, by defining the conditions whereby the decision of a new case is forced by a body of previous cases. However, in these models the consistency of the starting case base is assumed, i.e. it is required that no previous case has already violated the precedential constraint; the consequence of such an assumption is that no conflict of prece-

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dents can be found in deciding a new case. The consistency requirement can be unrealistic and not met by real legal case bases, as emphasized in [7]. For this reason, in [10], we expanded the scope of the use of CMs with respect to [18] and have abandoned the consistency assumption. To this extent, we introduced a preference order among cases, whereby in the event of conflict between precedents the preferred precedent should be followed. This solution seemed reasonable to us, since the preference order may result, for example, from the hierarchy of courts issuing the conflicting decisions and/or temporal dimension of cases, i.e., when the cases were decided. The need to consider these two elements, in order to model a precedential constraint that is more adherent to legal practice (at least for common law systems) was already highlighted in [6]. There, besides a horizontal precedential constraint, a tighter vertical precedential constraint, depending on court hierarchiy and based on the so called strict model is introduced.

In this paper, we pursue the intuition that legal case-based reasoners are nothing but binary classifiers, and we address the need to consider both the hierarchical and time element from the perspective of CMs. The paper is structured as follows. Section 2 enriches the CMs with three components: 1) an organization, specifying the hierarchy of courts and which courts issue binding decisions with respect to other courts; 2) a preorder, which determines the temporal relation between cases; and 3) a relevance relation among cases. On this basis, Section 3 formally defines the notion of precedent and binding precedent. The latter is a potentially constraining case for later decisions, in the sense that it is susceptible to two possible exceptions: it can be overruled by a later decision of a court which is entitled to do so, or it can by declared assessed *per incuriam*. *Per incuriam* cases are decided in the ignorance of a binding authority, i.e., in the ignorance of a binding precedent. In our framework we can define both notions of overruled and *per incuriam* precedents. Taking into account only binding precedents without exceptions, Section 4 formalizes a temporal and hierarchical principle for handling conflicting precedents and verifies when this principle defines an unambiguous decision process.²

2. Organization/Jurisdiction and Temporal Jurisdictional Classifier Models

In this section we instantiate the hierarchical and temporal dimensions in the framework of CMs. First, we define the notion of organisation, which characterises the specific legal system. It specifies the courts, the hierarchical relation among them and which courts issue binding decisions. As in [6], we assume that court hierarchy has a tree structure.

Definition 1 (Organisation/jurisdiction). We call organisation/jurisdiction the triple $Org = (Courts, \mathcal{H}, \mathcal{B})$. Where: 1) Courts is a finite and non-empty set of courts; 2) $\mathcal{H}, \mathcal{B} \subseteq Courts \times Courts$; 3) \mathcal{H} is transitive and irreflexive³; 4) \mathcal{H} is "tree like", i.e. for all $c_i, c_j, c_k \in Courts$ if $c_k \mathcal{H} c_i$ and $c_j \mathcal{H} c_i$ then $c_k \mathcal{H} c_j$ or $c_j \mathcal{H} c_k$ or $c_j = c_k$; 5) there is a root $c_0 \in Courts$ such that for any $c_i \in Courts$, $c_0 \mathcal{H} c_i$.

 $c_i \mathcal{H} c_j$ is read as " c_i is hierarchically higher than c_j "; $c_i \mathcal{B} c_j$ is read as " c_i issues binding decisions for c_j ". We did not specify the link between hierarchical and binding relations. Thus, different legal systems could be addressed. However, in this

²The paper with proofs is available here: https://arxiv.org/abs/2410.10567

³We adopt following definition of irreflexivity: not $c\mathcal{H}c$, for all $c \in Courts$.

work, we will focus on *common law systems*. Within common law systems, typically, 1) *vertical stare decisis* applies, i.e. decisions of higher courts bind lower courts: if $c_i \mathcal{H} c_j$ then $c_i \mathcal{B} c_j$; 2) lower courts have no binding power on higher courts and two not hierarchically related courts don't issue binding decisions one for the other: if not $c_i \mathcal{H} c_j$ then not $c_i \mathcal{B} c_j$; 3) *horizontal stare decisis* may apply, i.e. some c_i may be self-bound, namely $c_i \mathcal{B} c_i$. Ultimately, from 1), 2) and 3) follows

$$\mathscr{H} \subseteq \mathscr{B} \subseteq \mathscr{H} \cup \mathscr{I} \tag{SD}$$

where \mathcal{I} is the identity relation on Courts.

Example 1. We will take inspiration from the civil court system of England and Wales. In this system vertical stare decisis applies. At the top of the courts hierarchy there is the Supreme Court of UK (which we will call c_0). Officially, the Supreme Court is not bound by its own previous decisions, but it regards them as binding (although, the "Court may depart from them when it appeared 'right to do so'."[21] We will return to this later). So, we treat the Supreme Court as self-bound. Below the Supreme Court there is the Court of Appeal (which we will call c_1), which issues binding decisions for itself. Further down the hierarchy, there is the High Court (c_2). For simplicity, we will say that the High court is bound by its own decisions. 4 Below the High court there are the County Courts (about 170 [24]) that do not issue binding decisions. For simplicity, we will not consider all 170 County Courts but only two of them (c_3 and c_4). We model the courts system described as follows. We define the set of courts c_3 and c_4 . We model the courts system described as follows. We define the set of courts c_3 and c_4 . We model the courts system what we said sofar, c_0 , c_1 and c_2 are self-bound. Then, the binding relation is c_3 and c_4 we were c_3 and c_4 and c_4 are self-bound. Then, the binding relation is c_4 and c_4 and c_5 are self-bound in c_5 our organisation is c_5 and c_6 and c_6 are c_6 and c_6 are self-bound. Then, the binding relation is c_6 and c_6 and c_6 are self-bound.

The fundamental principle behind the doctine of *stare decisis* is that a case at hand must be decided in the same way of a relevant and binding precedent. However, decisions may sometimes be overruled. Overruling occurs when a court decides a case differently from a relevant (binding) precedent [19,23]. Not all courts have overruling power. We will assume that a higher court c_i can always overrule a decision made by a lower court (such a precedent is not binding for c_i but could be binding for another lower court). Moreover, we will assume that a court can overrule its own precedents if certain conditions are met in the decision for the new case. The practice in the UK Supreme Court, for example, is to sit in a larger panel than usual when overruling its previous decisions [14,19]. Actually, we won't specify which conditions must be met: in the description of each case we will simply add a parameter if in deciding the case the court can overrule its own precedents.

We introduce now the temporal and jurisdictional classifier models. We start by considering a *finite* set of possible input values of the classifiers, Atm_0 . In Atm_0 there are: variables describing the facts of the case, belonging to the finite set Facts; the courts that can make the decision, belonging to the finite set Courts; a parameter l that, intuitively, means that the court assessing the case at hand can overrule a previous decision made by the same court. So, $Atm_0 = \text{Facts} \cup \text{Courts} \cup \{l\}$. The classifier outputs have values in $Val = \{1,0,?\}$ where elements stand for *plaintiff wins*, *defendant wins* and *absence of decision* respectively. For $o \in \{0,1\}$, the "opposite" \overline{o} is noted for the value 1-o.

⁴Actually, some authorities suggest that High Court is self-bound only if it acts as appellate court [12].

Definition 2 (Temp. Jur. Classifier Model). A temporal jurisdictional classifier model is defined as the tuple $C = (S, f, Org, \leq_T, \mathcal{R})$. Where, $S \subseteq 2^{Atm_0}$ is a set of states, s.t. $\forall s \in S, \exists ! c \in \text{Courts } s.t. \ c \in s; \ f : S \longrightarrow Val \ is \ a \ classification function; <math>Org \ is \ an \ organisation; \leq_T \ is \ a \ total \ preorder \ on \ S^5 \ and \ \mathcal{R} \subseteq S \times S \ is \ a \ binary \ relation \ on \ S.$

Each state of the model contains a factual situation together with a unique court. In this sense, a state $s \in S$ represents a case presented to a specific court $c \in Courts$. In each state we can have an additional parameter l: if $l \in s$, we know that the court $c \in s$ can decide the case overruling a previous decision made by c itself.

The classification function maps each state into a possible value, namely $\{0,1,?\}$. These values represent the decision associated to each case. So that, for each $s \in S$, we can have either that f(s) = o, with $o \in \{0,1\}$ and so s represents an assessed case; or we can have that f(s) = ?, and so s is an unassessed/new case.

Org, specifies the hierarchical and binding relations between the courts (see Def. 1). \leq_T is a temporal preorder: $s \leq_T s'$ is read as "s' was not assessed before s". We will say that s is simultaneous to s', noted $s =_T s'$, iff $s \leq_T s'$ and $s' \leq_T s$. From \leq_T we can retrieve the strict order $<_T$: $s <_T s'$ iff $s \leq_T s'$ and $s' \not\leq_T s$. Then, $s <_T s'$ means "s was strictly decided before s". We have chosen to use a preorder between the states, and not an order. In this way, we allow for two cases to be simultaneous. It could be argued that, given two cases, it is always possible to determine which was decided first. However, the temporal dimension was mainly introduced to determine which precedents could be considered binding. We claim here that, given a case s, a relevant case s' decided the same day or the same week cannot be considered binding: the court assessing s would not have the possibility to take s' into account (just because, e.g., the reasons of s' have not yet been released). In this sense we can consider two cases decided on the same day or in the same week as simultaneous, depending on the temporal granularity chosen.

 \mathscr{R} characterises the notion of *relevance*: $s\mathscr{R}s'$ is read as "s is relevant for s'." We write $\mathscr{R}(s') = \{s \mid s\mathscr{R}s'\}$, for the set of states that are relevant for s'. The relevance relation will be crucial in defining the notion of precedent. Roughly, a precedent for a case is a relevant previously assessed case. We don't impose any specific notion of relevance on the model. Also, no specific property is required for the relevance relation. This allows us to take different notions of relevance into account. For example, we will show that a relevance relation can be defined within the model, based on the *a fortiori reasoning* introduced in Horty's result model [13].

Henceforth, we will consider *complete* classifier models. These models take into account every possible combination of facts and courts; moreover, if a court c is not self-bound, the classifier considers, among the states containing c, only those containing also the parameter l (since c is not self-bound, it can overrule its own decisions). Finally, the temporal relation is such that new cases are always strictly after already assessed cases.

Definition 3 (Complete classifier). Let $\overline{2}^{Atm_0} =_{def} \{ s \in 2^{Atm_0} \mid l \in s \text{ if not } c \mathcal{B}c, \text{ where } c \in s \}$. Then, a classifier model $C = (S, f, Org, \leq_T, \mathcal{R})$ is complete iff $S = \overline{2}^{Atm_0}$ and $\forall s, s' \in S \text{ s.t. } f(s) \neq ?$ and f(s') = ?, $s <_T s'$.

As mentioned above, we can define a relevance relation extracted from the "a fortiori constraint" introduced by Horty in the context of the result model [13]. We adapt

 $^{5 \}le T$ is a transitive, reflexive relation such that forall $s, s' \in S$, $s \le T$ s' or $s' \le T$ s.

notation of [18]. In the result model, the facts are called factors. These are "legally relevant fact patterns favouring one of the two opposing parties". Thus, we can have: factors for the plaintiff (Plt) and factors for the defendant (Dfd). So, Facts $= Plt \uplus Dfd$. We use following notation: for $o \in \{0,1\}$, Facts o = Plt iff o = 1, Facts o = Plt iff o = 0.

Definition 4 (A fortiori-based relevance, \mathcal{R}_F). Consider an assessed case, so a state $s \in S$, such that f(s) = o, $o \in \{0,1\}$. Let $s' \in S$. Then, based on a fortiori constraint, s is relevant for s', namely $s\mathcal{R}_F s'$, iff $s \cap \mathsf{Facts}^o \subset s' \cap \mathsf{Facts}^o$ and $s' \cap \mathsf{Facts}^{\overline{o}} \subset s \cap \mathsf{Facts}^{\overline{o}}$.

Namely, suppose that f(s) = 1. Then $s\mathcal{R}_F s'$, iff s' has: a) at least the same factors in favour of 1 that are in s, b) no more factors in favour of 0 with respect to s.

Example 2 (Running example). Consider Org_{ex} of Example 1. Let $Atm_0 = Facts \cup \{l\} \cup Courts_{ex}$. Suppose $Facts = Plt \uplus Dfd$, with $Plt = \{p,q,r\}$, $Dfd = \{t,v\}$. Let $s_1 = \{p,t,v,c_0\}$, $s_2 = \{p,r,t,v,c_1\}$, $s_3 = \{p,r,t,v,l,c_0\}$, $s_4 = \{p,t,v,c_1\}$, $s_5 = \{p,t,q,c_1\}$. Let $f = \overline{2}^{Atm_0} \longrightarrow \{0,1,?\}$ s.t $f(s_1) = f(s_2) = f(s_4) = 1$, $f(s_3) = f(s_5) = 0$, and f(s) = ? otherwise. Consider the temporal preorder \leq_T on S s.t. $s_1 <_T s_2 <_T s_3 <_T s_4 <_T s_5 <_T s'$, for any s' s.t f(s') = ?. We define the classifier model $C_{ex} = (\overline{2}^{Atm_0}, f, Org_{ex}, \leq_T, \mathscr{R}_F)$. Consider the new case $s^* = \{p,t,q,v,c_2\}$ to be decided by court c_2 , i.e. $f(s^*) = ?$. It can be verified that, $\mathscr{R}_F(s^*) = \{s_1,s_4,s_5\}$, $s_1,s_2 \in \mathscr{R}_F(s_{s_3})$, $s_3 \in \mathscr{R}_F(s_{s_4})$, $s_4 \in \mathscr{R}_F(s_{s_5})$.

 \mathscr{R}_F is neither reflexive, symmetric nor transitive. E.g. non reflexivity follows from the fact that, if f(s) = ?, then obviously $s \notin \mathscr{R}_F(s)$, by definition. This is one reason why we have not imposed any properties on the relevance relation. But, \mathscr{R}_F satisfies a variant of left-euclideanity that applies only to cases decided in opposite directions.

Proposition 1. Let $s, s', s'' \in S$, $f(s) = o \in \{0, 1\}$. If $f(s') = \overline{o}$, $s\mathscr{R}_F s''$ and $s'\mathscr{R}_F s''$, then $s\mathscr{R}_F s'$ and $s'\mathscr{R}_F s$.

3. Precedents, Binding Precedents, Overruled and Per Incurian Precedents

Based on the relevance relation we define the notion of supporting precedent: s is a supporting precedent, or simply a precedent, for s' if s is relevant for s' and decided before s'. In this section, for $s, s', s'' \in S$, we denote their courts c, c', c'', (e.g. $c \in s \cap Courts$).

Definition 5 (Supporting precedent). Let $s, s' \in S$ and $o \in \{0, 1\}$. s is a (supporting) precedent for s' in the direction of o, noted $\Pi(s, s', o)$, iff $f(s) = o, s \in \mathcal{R}(s')$ and $s <_T s'$.

Henceforth, we will focus on binding precedents. Binding precedents for a state s' decided by court c' are those precedents issued by a court c that has binding power on c'.

Definition 6 (Binding precedent). Let $s, s' \in S$ and $o \in \{0, 1\}$. s is a binding precedent for s', for a decision as o, noted $\beta(s, s', o)$, iff $\Pi(s, s', o)$ and $\mathcal{B}(c, c')$. We simply write $\beta(s, s')$ iff there is $o \in \{0, 1\}$ s.t. $\beta(s, s', o)$.

As discussed before, we are considering legal systems in which vertical stare decisis applies and horizontal stare decisis may apply. From (SD), we have the following.

Proposition 2. Let $s, s' \in S$. If $\beta(s, s')$ then $\mathcal{H}(c, c')$ or c = c'.

Example 3 (Ex. 2 continued). Recall $\mathcal{R}_F(s^*) = \{s_1, s_4, s_5\}$. For $s \in \mathcal{R}_F(s^*)$, $s <_T s^*$, so every s is a precedent for s^* ($\Pi(s, s^*, f(s))$, and is binding for s^* , ($\beta(s, s^*, f(s))$, since it assessed by a higher court than s^* . Also, $s_1, s_2 \in \mathcal{R}_F(s_{s_3})$ are precedents for s_3 , but only s_1 is binding ($\beta(s_1, s_3)$), (s_2 is decided by a lower court). Also, $\beta(s_3, s_4)$ and $\beta(s_4, s_5)$.

As mentioned in the previous section, not all courts can overrule previous decisions. We assumed that c' has the power to overrule a decision made by c, in deciding a case s' if: 1) c' is hierarchically higher than c, or if, 2) c' = c and in the decision of s' the conditions for c to overturn its own precedents are met, namely if $l \in s$. With conditions 1) and 2) we establish that a lower court cannot overrule a higher court.⁶

Definition 7 (Overruling power). Let $s' \in S$. Court c' has the power to overrule (a decision by) court c, when deciding s', noted $O(c', c \mid s')$, iff $\mathcal{H}(c', c)$ or $(c' = c \text{ and } l \in s)$.

We can now define the notion of overruled case. Intuitively, a case s' overrules a precedent s, when s' is decided by c' in the opposite direction wrt. to s and c' has overruling power over c, when assessing s' (i.e. $O(c', c \mid s')$).

Definition 8 (Overruled case/state). Let $s, s' \in S$. s' overrules s, noted O(s', s), iff $\Pi(s, s', o), f(s') = \overline{o}$, and $O(c', c \mid s')$. We write $Overruled_T(s, s')$, to mean that s was overruled before s' is assessed iff there is $s'' \in S$, s.t. O(s'', s) and $s'' <_T s'$.

As consequence of Def. 7 a later case s' overruled s if: it was decided by a higher court or it was decided by the same court and $l \in s'$. Hence, if a state s' overrules a binding precedent s, necessarily it is decided by the same court and $l \in s'$.

Proposition 3. Let
$$s, s' \in S$$
. If $\beta(s, s')$ and $O(s', s)$ then $c = c'$ and $l \in s'$.

Overruled cases are no longer binding for subsequent decisions. In this, overruling constitutes an exception to binding precedents. We can therefore start filtering the binding cases for s, eliminating the cases that were overruled at the time s was decided. In doing so we also check whether $l \in s$: if a court can overrule itself in deciding s (i.e. $l \in s$) then it is not bound by its own precedents. In this situation we will remove the precedents issued from the same court from the set of binding precedents.

The set of binding precedents not overruled when s was decided is

$$\tilde{\beta}_s = \begin{cases} \{s' \mid \beta(s',s) \text{ and not } Overruled_T(s',s)\} & \text{if } l \not\in s; \\ \{s' \mid s \cap \mathsf{Courts} \neq s' \cap \mathsf{Courts}, \beta(s',s) \text{ and not } Overruled_T(s',s)\} & \text{otherwise.} \end{cases}$$

Clearly, s has no power to overrule any precedent in $\tilde{\beta}_s$.

Proposition 4. If $s' \in \tilde{\beta}_s$, then not $O(c, c' \mid s)$.

Example 4 (Ex 2 continued). s_1 and s_2 are precedents for s_3 . s_3 overrules s_2 , $(O(s_3, s_2))$, since $\mathcal{H}(c_0, c_1)$, $c_0 \in s_3$ and $c_1 \in s_2$. s_3 overrules s_1 : $c_0 \in s_1 \cap s_3$ and $l \in s_3$. $s_3 <_T s^*$, then $Overruled_T(s_1, s^*)$. Recall, s_1, s_4, s_5 are binding for s^* . s_4, s_5 are not overruled (s_4 is only precedent of s_5 , but $l \notin s_5$); then $\tilde{\beta}_{s^*} = \{s_4, s_5\}$. Also, s_3 is not overruled and is binding for s_4 , so $s_3 \in \tilde{\beta}_{s_4}$. $s_4 \in \tilde{\beta}_{s_5}$ ($\beta(s_4, s_5)$, s_4 not overruled, $c_1 \in s_4 \cap s_5$ and $l \notin s_5$).

⁶I.e. no anticipatory overruling is permitted. By "anticipatory overruling of a precedent we refer to a lower court refusing to follow a precedent in anticipation of the likelihood that a higher court will overrule it" [19].

To some extent, we can say that an overruling case is a case that legitimately went against a relevant precedent, in the sense that it was decided in the opposite direction. Suppose now that there is $s' \in \tilde{\beta}_s$, s.t. $f(s') = o \in \{0,1\}$ and $f(s) = \overline{o}$. It would seem that s went against a *binding* precedent, illegitimately. The question is whether s is to be considered to be decided *per incuriam*, that is in "ignorance of relevant binding authority" [19]. Broadly, if a precedent is decided *per incuriam*, it loses its bindingness on later cases. In modelling the notion of *per incuriam*, we take three interrelated aspects into account.

- 1) Not all courts can disregard a previous decision taken *per incuriam* [15]. Specifically, we assume that a lower court cannot disregard a *per incuriam* precedent issued by a higher court, to which it nevertheless remains bound. Instead, we claim that a court may disregard a *per incuriam* binding precedent if it was decided by the same court.
- 2) We infer from the model which cases are decided *per incuriam*; such information is not already given in the case base. Coming back to our question, suppose s went against a $s' \in \tilde{\beta}_s$. Is this enough to say that s was decided *per incuriam*? It depends. If s' was decided by a higher court, then s was in any case *per incuriam*, since s could no disregard it. Suppose instead s and s' were decided by the same court, then in deciding s, the court could have found that s' went itself against a binding precedent $s'' \in \tilde{\beta}_{s'}$. But to be sure that s' was *per incuriam*, and so not actually binding for s, we have to check whether s'' was *per incuriam* or not, and so on. In this sense, for determining whether s was *per incuriam* we have to check each sequence of binding precedents that originates from s.

We want to capture all these insights in the definition of *per incuriam*. To do so, we must first define the set of best hierarchical binding precedents in $\tilde{\beta}_s$.

Definition 9. Let $\tilde{S} \subseteq S$, $\mathsf{Best}_H(\tilde{S}) = \{s \in \tilde{S} \mid \not \exists s' \in \tilde{S} \ s.t \ \mathscr{H}(c',c)\}$. Let $s \in S$, the set of the best hierarchical precedents not overruled when s was decided is $\mathsf{Best}_H(\tilde{\beta}_s)$.

To determine whether s was decided per incuriam, we first recursively generate the following graph G = (V, E). At step 0 of the recursion, the graph $(G_0 = (V_0, E_0))$ has only one node s $(V_0 = \{s\})$ and no edge $(E_0 = \emptyset)$. At step 1, we add to the nodes the states s', that are the best hierarchical binding precedents for s $(V_1 = \{s\} \cup \{s \mid s' \in Best_H(\tilde{\beta}_s)\})$.

⁷In the UK case Cassell v Broome, it was affirmed that the Court of Appeal could not disregard a House of Lords decision, even though *per incuriam* [19]. In Canada, the same principle is usually adopted [22].

⁸This is clearly stated for the UK Court of Appeal in Young v. Bristol Aeroplane Co. (1944).

Edges joining s to each s' are added $(E_1 = \{(s,s') \mid s' \in Best_H(\tilde{\beta}_s)\})$. In step 2, we reiterate the procedure for each node added at step 1. The procedure is finite, the set of states S being finite. Note that a state is never a binding precedent for itself, so that there are no loops in the graph G. Now, we compute whether s is per incuriam, by recursively exploring the graph G. We claim that s is per incuriam if: 1) there is s', adjacent node to $s((s,s') \in E)$, such that s was decided in the opposite way $(f(s) \neq f(s'))$, and such that if s' was decided per incuriam then it was decided by a higher court than s (Incuriam(s') \Rightarrow $\mathcal{H}(c',c)$); 2) there is no s'', adjacent node to $s((s,s'') \in E)$, decided in the same direction as s(f(s) = f(s'')), at the same time or after $s'(s' \leq_T s'')$, such that if s'' was decided per incuriam then it was decided by a higher court (Incuriam(s'') \Rightarrow $\mathcal{H}(c'',c)$).

Definition 10 (Per incuriam). Let $s \in S$, with $f(s) = o \in \{0,1\}$. Let $G = (V,E) = \bigcup_{n>0} G_n$, the recursively defined oriented graph, where,

- $G_0 = (V_0, E_0)$, where $V_0 = \{s\}$ and $E_0 = \emptyset$;
- $G_{n+1} = (V_{n+1}, E_{n+1})$, where $V_{n+1} = V_n \cup \{s' \mid s' \in Best_H(\tilde{\beta}_{s''}), \text{ with } s'' \in V_n\}$ and $E_{n+1} = E_n \cup \{(s'', s') \mid s' \in Best_H(\tilde{\beta}_{s''}), \text{ with } s'' \in V_n\}$.
- s was decided per incuriam, noted Incuriam(s), iff
- $\exists s', s.t. (s,s') \in E \text{ and } f(s) \neq f(s'), \text{ and } (Incuriam(s') \Rightarrow \mathcal{H}(c',c)) \text{ and }$
- $\nexists s''$ s.t $(s,s'') \in E$ and f(s) = f(s''), $s' \leq_T s''$ and $(Incuriam(s'') \Rightarrow \mathcal{H}(c'',c))$.

Example 5 (Ex. 2 continued). Recall $s_3 \in \tilde{\beta}_{s_4}$, $f(s_3) \neq f(s_4)$. s_3 was decided by c_0 a higher court than $c_1 \in s_4$, so Incuriam (s_4) . Recall $s_4 \in \tilde{\beta}_{s_5}$. $f(s_4) \neq f(s_5)$. But, Incuriam (s_4) and s_4 and s_5 are decided by the same court. Hence, s_5 is not per incuriam.

We can now define for each s, the set of binding precedents without exception, β_s . We exclude from the set $\tilde{\beta}_s$ the precedents decided *per incuriam by the same court*.

Definition 11 (Binding precedents without exception). *The set of binding precedents without exceptions for s is* $\beta_s = \tilde{\beta}_s \setminus \{s' \in \tilde{\beta}_s \mid s' \cap \text{Courts} = s \cap \text{Courts} \text{ and } Incuriam(s')\}.$

Example 6 (Ex. 2 continued). Recall $\tilde{\beta}_{s^*} = \{s_4, s_5\}$ and $Incuriam(s_4)$. $c_1 \in s_4$ is higher than $c_2 \in s^*$. Then $\beta_{s^*} = \tilde{\beta}_{s^*}$. s_4 and s_5 have the same court. So, $\mathsf{Best}_H(\beta_{s^*}) = \beta_{s^*}$. Note that \leq_T is an order on β_{s^*} , i.e.it is, besides transitive and reflexive, also antisymmetric.

From the previous example we notice that in $\mathsf{Best}_H(\beta_s)$ there may be *per incuriam* precedents decided by a higher court than the one in s. Actually, we can verify that if the relevance relation is \mathscr{R}_F (a fortiori reasoning based), the temporal relation is an order, and in $\mathsf{Best}_H(\beta_s)$ there are two cases decided in the opposite directions, then one of them is *per incuriam*. The result is a consequence of the property in Prop. 1.

Proposition 5. Let $C = (S, f, Org, <_T, \mathcal{R}_F)$, a complete classifier, with $<_T$ a total order. Let $s \in S$. If $\exists s', s'' \in \mathsf{Best}_H(\beta_s)$, s.t. $f(s') \neq f(s'')$, then Incuriam(s') or Incuriam(s'').

4. A Legal Principle for Conflict Situations

In the previous section, we stated that when there are conflicting binding precedents, the case at hand should follow the best temporal hierarchical binding precedents, namely the

the most recent cases decided by the highest court. The reason for this is that political, economic or social changes may affect a court's approach to a precedent [19]. Such a principle is adopted, for example, by courts in the United States [19,6]. We refer to this principle as the *temporal hierarchical principle*. In this section we formally define a decision making process for a new case s^* ($f(s^*) = ?$) based on the temporal hierarchical principle. We verify when such a decision process is unambiguous.

Definition 12 (Decision making process/function). Let $s^* \in S$. A decision making process/function for s^* , is any function $f^* : S \to 2^{\{0,1\}}$ defined as follows:

$$f^*(s) = \begin{cases} \{f(s)\} & \text{if } s \neq s^*; \\ V \in 2^{\{0,1\}} & \text{otherwise.} \end{cases}$$

So, a decision making process is a function that: to each state s other than s^* assigns the singleton given by the evaluation of the classification function in s; to s^* assigns a subset V of $\{0,1\}$ (possibly empty). On the basis of the cardinality of V we determine whether the decision process is unambiguous.

Definition 13. Let $f^*: S \to 2^{\{0,1\}}$ be a decision making process. We say that: 1) no decision can be made for s^* iff $f^*(s^*) = \emptyset$; 2) f^* is unambiguous for s^* iff $|f^*(s^*)| = 1$; 3) f^* is ambiguous for s^* iff $|f^*(s^*)| > 1$.

Thus, the decision making function f^* is ambiguous for s^* iff $f^*(s^*) = \{0, 1\}$, i.e. when s^* can be decided both as 0 and as 1 (thus, we have a conflict situation). A first approach to set a decision making process could rely on binding precedents. Let s^* be as in Ex. 6 and suppose to define a decision making function associating to s^* the values (0 or 1) assumed by its binding precedents in β_{s^*} , i.e. s.t. $f^*(s^*) = \{f(s') \mid s' \in \beta_{s^*}\}$. So, since $s_4, s_5 \in \beta_{s^*}$, $f^*(s^*) = \{0, 1\}$. We obtain an ambiguous decision making process for s^* . We now formalise a decision making process based on the *Temporal Hierarchical Principle*.

Definition 14. The set of latest states in $\tilde{S} \subseteq S$ is $\mathsf{Best}_\mathsf{T}(\tilde{\mathsf{S}}) = \{\mathsf{s} \in \tilde{\mathsf{S}} \mid \forall \mathsf{s}' \in \tilde{\mathsf{S}} : \mathsf{s}' \leq_\mathsf{T} \mathsf{s}\}$. The set of best temporal hierarchical states in \tilde{S} is $\mathsf{Best}_\mathsf{TH}(\tilde{S}) = \mathsf{Best}_\mathsf{T}(\mathsf{Best}_H(\tilde{S}))$.

Definition 15 (Temporal Hierarchical Principle). *The decision making function* $f_2^*: S \to 2^{\{0,1\}}$, *based on binding precedents, according to the temporal hierarchical principle is*

$$f_2^*(s) = \begin{cases} \{f(s)\} & \text{if } s \neq s^* \\ \{f(s') \mid s' \in Best_{TH}(\beta_{s^*})\} & \text{otherwise.} \end{cases}$$

 f_2^* assigns to s^* the set of the outcomes of the elements in $Best_{TH}(\beta_{s^*})$, which are the latest binding precedents for s^* , without exceptions, decided by the higher court.

Example 7 (Ex. 2 continued). *Recall that Best*_H(β_{s^*}) = { s_4 , s_5 }. *Notice that* $s_4 <_T s_5$, *hence Best*_{TH}(β_{s^*}) = { s_5 }. *So* $f_2^*(s^*)$ = { $f(s_5)$ } = {0}.

As hinted in the previous example, f_2^* is an unambiguous decision making for s^* when \leq_T is an order, namely also antisymmetic. Indeed, from antisymmetry it follows that cases cannot be synchronous and there is a unique latest case decided by the higher court. Differently stated, if the temporal relation between cases is a preorder, there may be synchronous conflicting states in $Best_H(\beta_{s^*})$ and thus f_2^* can be ambiguous.

Proposition 6. Suppose $\beta_{s^*} \neq \emptyset$. If \leq_T is a total order (at least on $Best_H(\beta_{s^*})$) then f_2^* is unambiguous decision making for s^* .

5. Conclusion

This work further develops the connection, already identified in [18], between CBR models and classifiers models (CMs). We have shown how two founding elements of legal decision-making, namely organization of courts and the temporal relationship between cases can be incorporated in CMs. We were then able to model the notion of precedent, binding precedent and binding precedents susceptible to exceptions: precedents decided *per incuriam* and overruled ones. Finally, we introduced a temporal and hierarchical principle for handling conflicting precedents and verified when this principle determines an unambiguous decision process. Some aspects deserve further discussion.

We first briefly discuss the relationship between our work and [6], which had already highlighted the need to consider temporal and hierarchical dimensions in precedent constraint models. As already amply emphasised, our work moves within the framework of CMs. In [6] two different models of precedential constraint are combined, starting from the assumption that the vertical precedent constraint is much tighter than the horizontal one; in this sense, even if not explicitly stated, the relevance relation between cases depends on which constraint applies. We don't make such a distinction. More specifically, we do not impose any specific notion of relevance between cases, in this sense our work moves on a more abstract level. For us, the vertical constraint is stronger only in the approach to per incuriam, when we argue that a per incuriam precedent cannot be ignored by a lower court. A further distinction pertains to how violations of the vertical constraint are handled: in [6], if a case in the case base violated the vertical constraint, then a decision for a new case cannot be forced (as, in [13], the precedential constraint cannot force a new case if the starting case base is not consistent); for us a case decided ignoring a vertical precedent is per incuriam and can simply be discarded. Also, differently from [6], we do not assume that horizontal constraint always applies, this depends on the binding relation associated to the CM. Finally, in [6] the temporal relation between the cases is a total order, for us is a total preorder; indeed, the temporal and hierarchical principle, also discussed in [6], is not always sufficient for us to solve conflicts.

A further discussion deserve the relevance and binding relations. Relevance is a "binary" notion: a case is either relevant to another or it is not, and if it is relevant it cannot be distinguished. In future work we aim to refine the relevance notion so that some cases can be more relevant than others. Furthermore, we did not impose any properties on the relevance relation, so that two cases may be relevant for a new case but not for each other. This will be important to develop a framework where multiple issues or intermediate factors have to be addressed to decide a case (see, among others [5,3,8,25]), so that two cases may be relevant to a new case but not to each other because they concern different issues/intermediate factors. Also, the notion of binding is "binary": a court issues binding decisions or not. But, sometimes, as suggested in [1], a binding relation between two agents of an institution may be context-dependent. It may happen, as is the case with the High Court in England, that a court binds only in specific situations. In the future, we plan to consider a more sophisticated binding relation.

Last but not least, in [17] CMs were defined as models for the modal logic BCL. Our goal is to develop an extension of the BCL logic and to provide a completeness result with respect to the class of temporal and jurisdictional CMs.

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