



Chemometric analysis of porcine, bovine and ovine heparins

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ABSTRACT

Heparin is a polysaccharide anticoagulant drug isolated from animal tissues. There have been concerns on the safety and security of the heparin supply chain since 2007–8 when a contamination crisis led to its disruption. The current study applies a suite of modern analytical techniques to porcine, bovine and ovine intestinal mucosal heparins. These techniques include structural analysis by nuclear magnetic resonance spectrometry, disaccharide compositional analysis, bottom-up analysis of tetrasaccharides corresponding to heparin's antithrombin III binding site. Chemometric analysis was then applied to understand how these structural differences to predict the animal/tissue source of heparin and to help detect blending of heparins from various sources.

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1. Introduction

Heparin is a natural product derived from the tissues of food animals that is widely used in modern medicine to control blood coagulation [1]. Discovered over 100 years ago, heparins introduction as a clinical anticoagulant predated the establishment of the US Food and Drug Administration (FDA) in 1937 [2]. The first clinically used heparin was prepared from bovine organ tissue at Connaught Laboratories, Toronto [2], and bovine sourced heparin was widely used in addition to porcine heparin well into the 1980's until a British outbreak of prion-based 'mad cow disease', or bovine spongiform encephalopathy (BSE) [3]. In the same time period, ovine heparin has niche applications in Oceania where sheep were prevalent. Since the 1990's, porcine intestinal mucosa has been the major tissue source of heparin-based products (*i.e.*, unfractionated heparin, low molecular weight heparins, and heparinized medical devices) requiring over 100 metric ton production and commanding a ~10 B\$ market [4,5]. Heparin is considered to be a critical drug

and without an adequate supply of heparin products the practice of modern medicine would not be possible [6].

In 2007–2008, there was a heparin crisis in which adulterated porcine heparin, coming from China, entered the world market leading to the deaths of nearly 100 patients [6,7]. In response to this crisis, world regulatory agencies and compendial organizations, such as the US FDA and the US Pharmacopeia (USP), increased their diligence in the regulation and analyses of this critically important drug [8]. Recently, there has been growing concern about the stability, security and safety of the world's supply of heparin. There are three major areas of concern: 1. Heparin comes from a single animal species that has been subject to disease outbreaks impacting herd size, production levels and prices; 2. Over half of the world's supply is controlled by a single country [9]; and 3. This complex, animal-sourced, polycomponent/polypharmacological polysaccharide drug (Fig. 1) leaves it susceptible to future adulteration, the presence of viral/prion impurities, and potential blending with heparin sourced from other species [10–12]. Indeed, these recent concerns have been clearly expressed by the US FDA and US Congress [13] and the blending with heparin sourced from other species has recently resulted in the withdrawal of heparin from the market in Europe [14].

The current study extends a principal component analysis (PCA) approach, recently introduced to measure numerical differences

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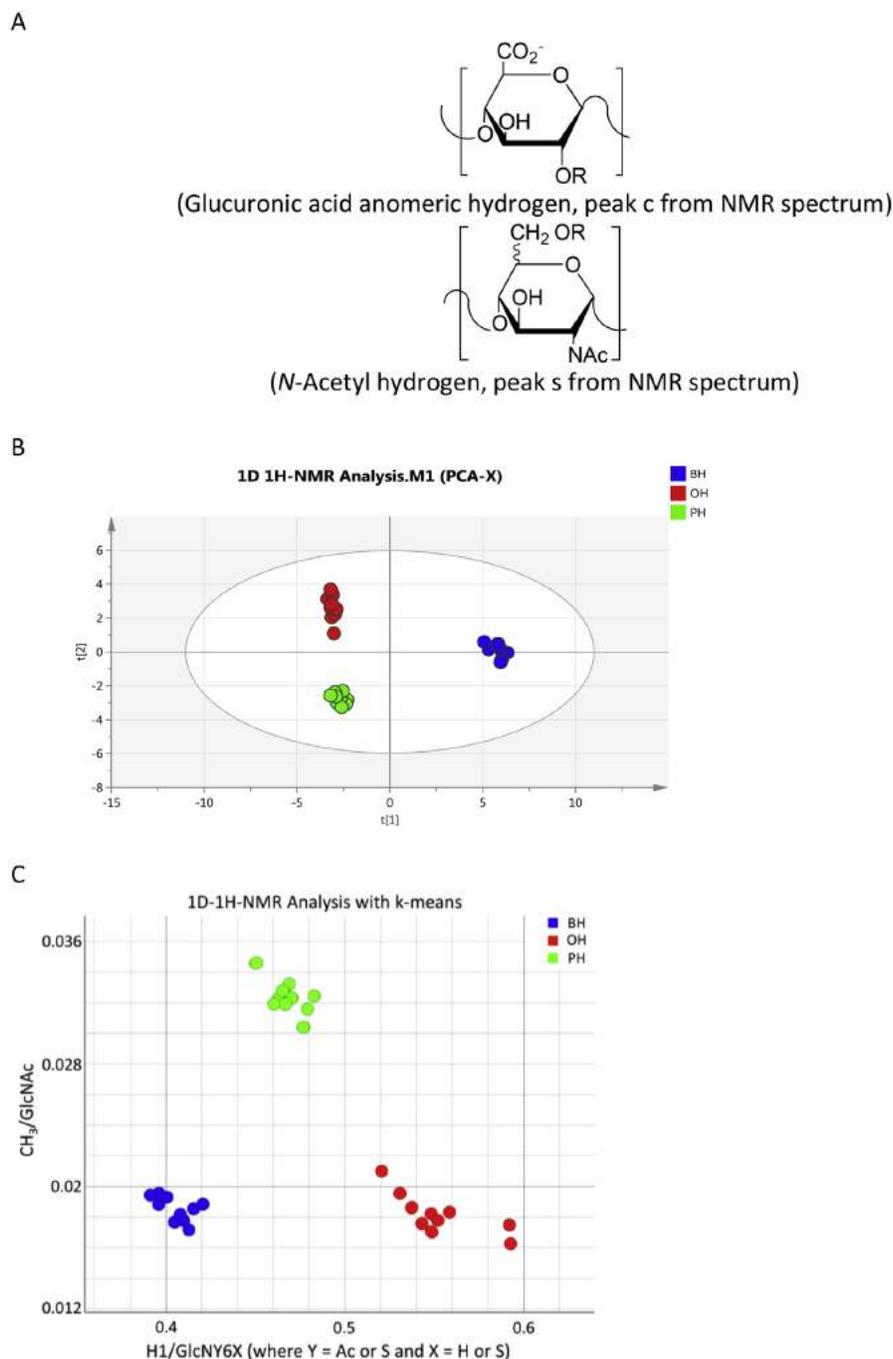


Fig. 2. Statistical analysis of bovine, ovine, and porcine heparin structures based on ^1H NMR information. (A) The structure units of heparin that caused major variance in NMR analysis. (B) PCA score plot of two first principle components of the NMR data sets. The first component explains 72.9% of the variation and the second component 21.5%. Samples were grouped by different animal source. (C) K-means clustering analysis of the NMR data, an example of top scoring feature pair is shown in panel c, when only using peak c H1/GlcNY6X (where Y = Ac or S and X = H or S) (Fig. S1) and paired with peak s CH3/GlcNAc, samples could clearly grouped into different animal sources. Bovine heparin (BH, blue), ovine heparin (OH, red) and porcine heparin (PH, green) (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article).

sophisticated analytical methods including NMR, mass spectrometry (MS), and hyphenated techniques such as bottom-up analysis [29] have facilitated very detailed mapping of a heparin's structural features.

We undertook to establish a suite of methods to examine structural differences between three currently used heparins, porcine

intestinal mucosal heparin, bovine intestinal mucosal heparin and ovine intestinal mucosal heparin (Fig. 1). Three analytical approaches, applied to 10 heparin samples from each animal source, were: 1. ^1H -NMR analysis of intact heparin; 2. disaccharide compositional analysis of heparin lyase 1, 2, 3-treated heparin using high performance liquid chromatography (HPLC)-MS; and 3.

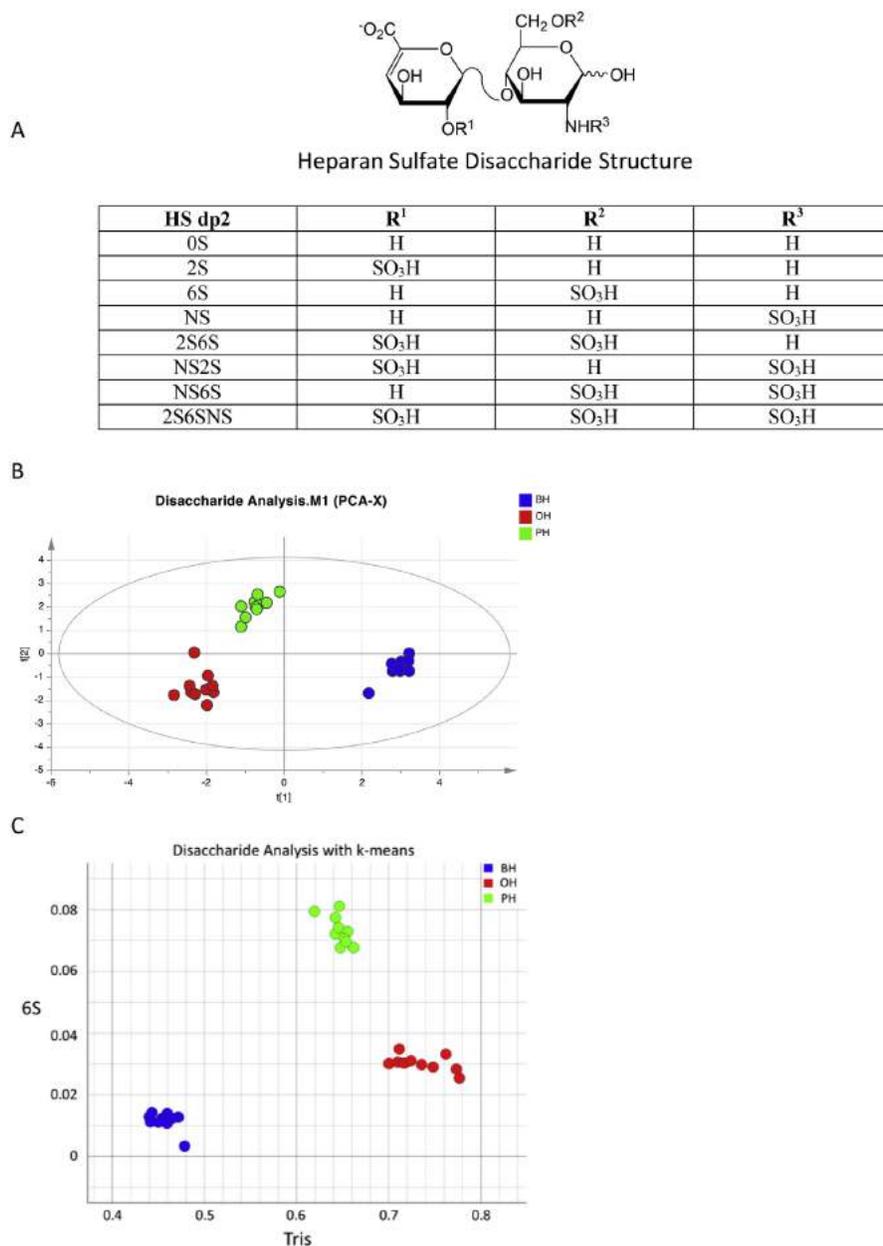


Fig. 3. Statistical analysis of bovine, ovine, and porcine heparin structures based on LC–MS disaccharide analysis. (A) The structure of eight standard heparan sulfate disaccharide. (B) PCA score plot of two first principle components of the disaccharide data sets. The first component explains 60.9% of the variation and the second component 30.9%. Samples were grouped by different animal source. (C) K-means clustering analysis of the disaccharide data, an example of top scoring feature pair is shown in panel c, when only using Tris and paired with 6S, samples could clearly grouped into different animal sources. Bovine heparin (BH, blue), ovine heparin (OH, red) and porcine heparin (PH, green) (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article).

bottom-up resistant tetrasaccharide analysis of heparin lyase 2-treated heparin using HPLC-MS. The analytical data obtained on each of the 30-heparin samples were then analyzed using PCA and by data mining using K-means to assess the numerical clustering of data and to understand the structural features behind this clustering.

One-dimensional 600 MHz ¹H-NMR analysis of the thirty heparin samples were obtained (Fig. S1). These spectra were assigned based on previously published two-dimensional spectra for selected porcine heparin (PH), bovine heparin (BH) and ovine heparin (OH) [18,26]. Twenty-four signals having distinctive chem-

ical shifts were assigned (Fig. S1) and these were integrated as the percentage of each total integrated spectrum and the resulting data was chemometrically analyzed (Fig. 2). As anticipated, the 10 PH, BH and OH heparins showed distinct non-intersecting clusters in the PCA analysis (Fig. 2b). The application of K-means analysis not only provided a similar degree of resolution between the heparins from each source but also identified the structural elements in each set that were different (Fig. 2b). Two of the assigned and resolved peaks, C at 5.34 ppm and S at 1.95 ppm, corresponding to the GlcNY6X (where Y = Ac or S and X = H or S) and the CH₃ sig-

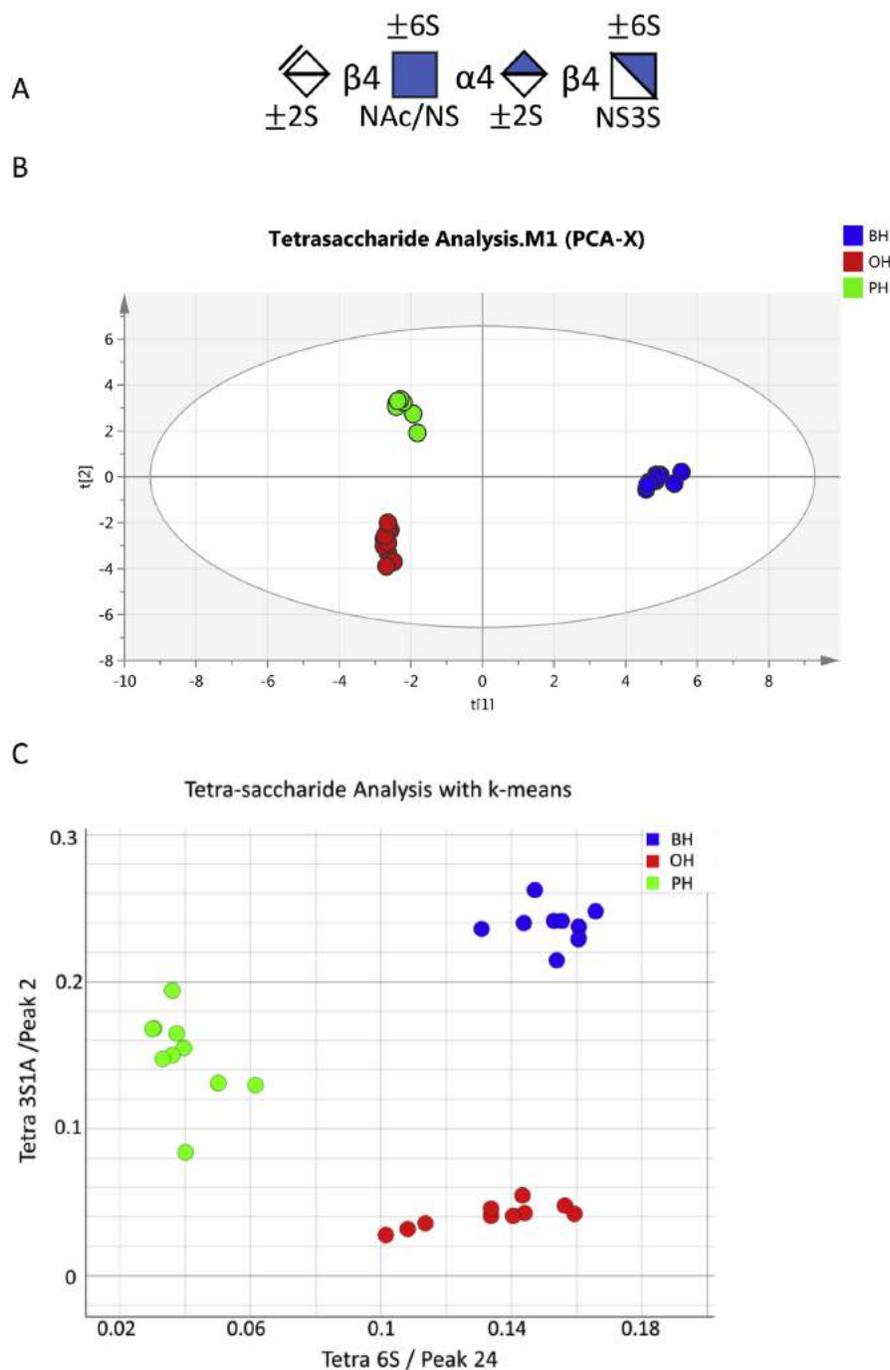


Fig. 4. Statistical analysis of bovine, ovine, and porcine heparin structures based on LC–MS tetrasaccharide analysis. (A) The general structure of tetrasaccharide. (B) PCA score plot of two first principle components of the tetrasaccharide data sets. The first component explains 59.4% of the variation and the second component 29.7%. Samples were grouped by different animal source. (C) K-means clustering analysis of the tetrasaccharide data, an example of top scoring feature pair is shown in panel c, when only using TriS and paired with 6S, samples could clearly grouped into different animal sources. Bovine heparin (BH, blue), ovine heparin (OH, red) and porcine heparin (PH, green). See figure legend 1 for definition of structural symbol nomenclature. The uncolored diamond is UA and Ac is acetyl (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article).

nal of GlcNAc, respectively, are diagnostic for porcine, bovine and ovine intestinal mucosal heparins.

Disaccharide compositional analysis of 30-heparins, using reverse-phase ion-pairing (RPIP) HPLC–MS, showed the presence of all 8 commonly reported heparin disaccharides but in dif-

ferent amounts (Fig. S2). Again, PCA analysis shows distinct non-intersecting clusters for the data analyzed for porcine, bovine and ovine heparins (Fig. 3b) and K-means analysis showed a similar data separation that was primarily dependent on the concentration of the TriS and 6S disaccharides.

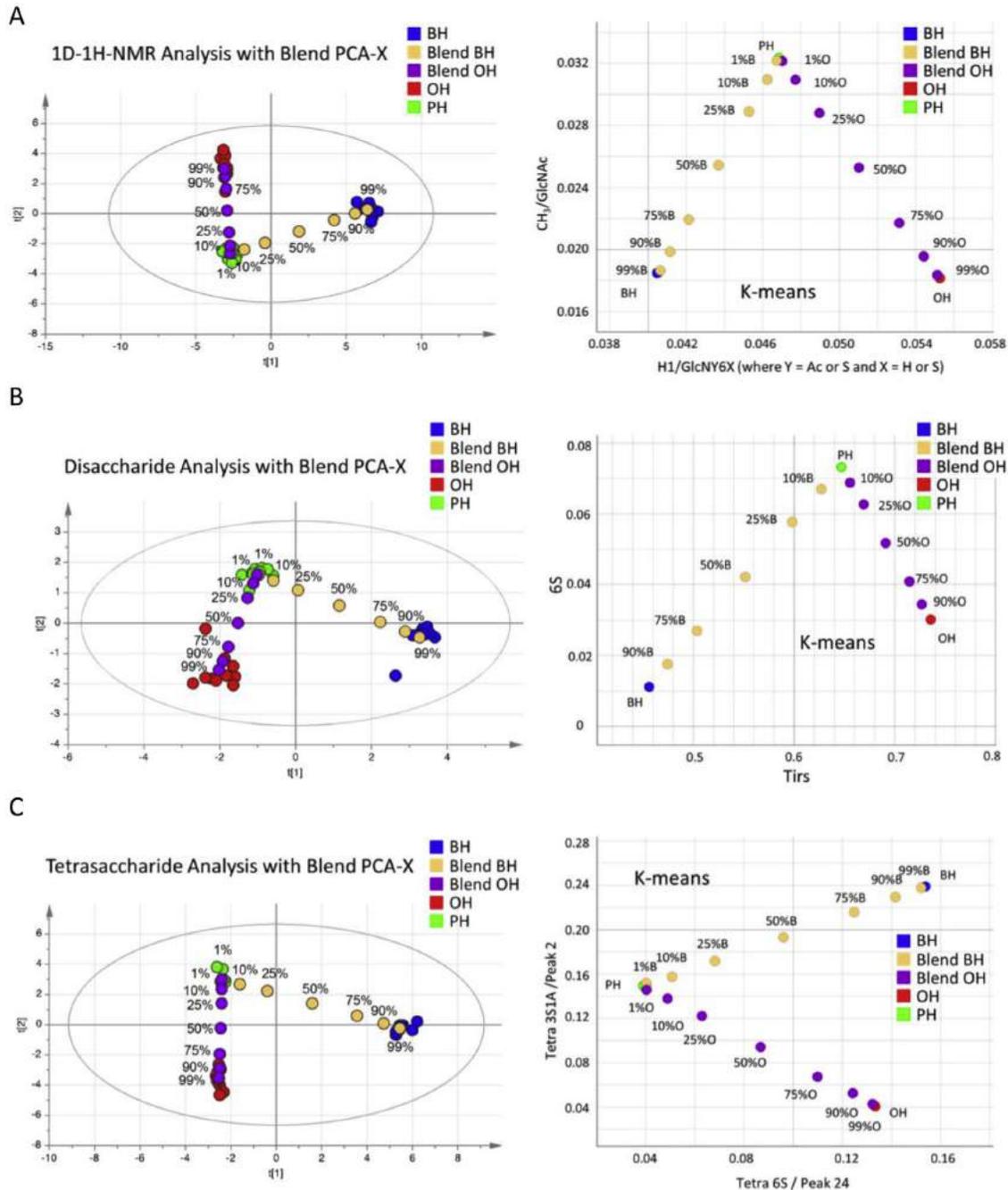


Fig. 5. The scatter plot of principal component analysis(left) and k-means (right) for porcine heparin blending bovine or ovine heparin based on (A) ^1H NMR analysis, (B) disaccharide analysis, and (C) tetrasaccharide analysis. Bovine heparin (BH, blue), ovine heparin (OH, red) and porcine heparin (PH, green) and blends of pH and BH (yellow) and pH and OH (purple) are shown (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article).

The glycosidic linkages between glucosamine and uronic acid at a disaccharide residue adjacent (on the non reducing side) to a 3-*O*-sulfoglucosamine, *N*-sulfoglucosamine residue containing disaccharide unit are known to be resistant to heparin lyase 2 [30]. This 3-*O*-sulfo, *N*-sulfoglucosamine residue is the critical, invariant central residue in heparins AT-binding site, thus, when anticoagulant heparin is exhaustively treated with heparin lyase 2 it gives rise to resistant tetrasaccharides containing half of heparins AT-binding site with a reducing terminal 3-*O*-

sulfo, *N*-sulfoglucosamine residue. The structures of these resistant tetrasaccharides give critical information on the structural variability of a heparin and the quantity and distribution of these resistant tetrasaccharides can be correlated to the anticoagulant activity of a heparin or LMW heparin [28,31]. Thus, a bottom-up analysis of the 30-heparin samples was undertaken with the goal of examining heparin lyase 2-resistant tetrasaccharides to better understand the structural differences in porcine, bovine and ovine heparins having the largest impact on their anticoagulant activity.

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