

Strukturelle Modellierung  
(Masterstudiengang Bioinformatik)

# **Strukturbestimmung mit NMR Spektroskopie**

Sommersemester 2013

Peter Güntert

# NMR Spektroskopie: Geschichte

1924, Wolfgang Pauli: Vorhersage des Kernspins

1933, Isidor Rabi: Molekularstrahlmagnetresonanzdetektion

1945: Edward Purcell, Felix Bloch: Kernspinresonanz (NMR)

1953: A. Overhauser, I. Solomon: Nuclear Overhauser Effekt

1966, Richard Ernst: Fouriertransformations-NMR

1971, Jean Jeener: 2D NMR Spektren

1981, Kurt Wüthrich et al.: Resonanzzuordnung in Proteinen

1984, Kurt Wüthrich et al.: 3D Proteinstruktur in Lösung

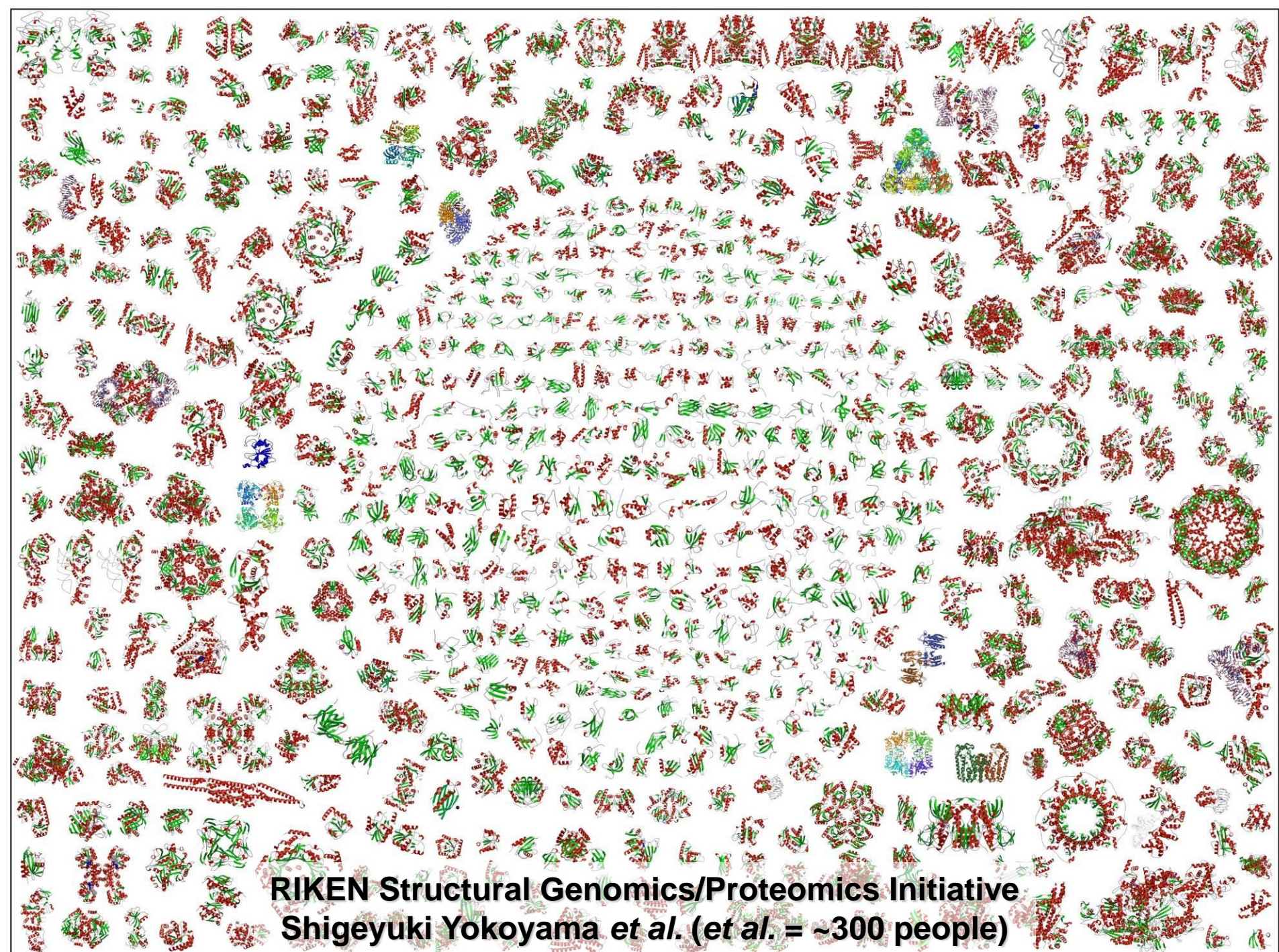
1991, Ad Bax et al.: Tripelresonanzspektren ( $^{13}\text{C}$ ,  $^{15}\text{N}$ ,  $^3\text{H}$ )

1997: TROSY, NMR Spektroskopie von großen Proteinen

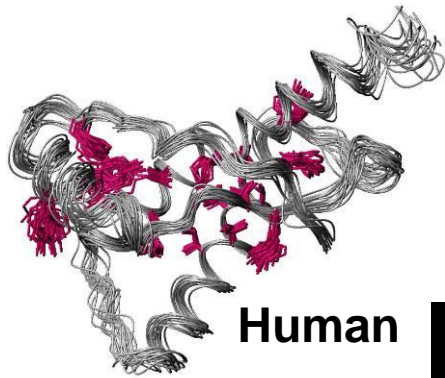
2013: ~9900 NMR Strukturen in der Protein Data Bank

# Literatur über NMR Proteinstrukturbestimmung

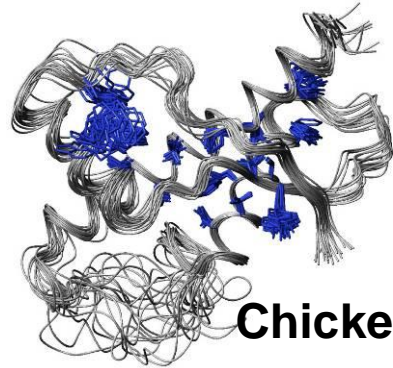
- K. Wüthrich, *NMR of Proteins and Nucleic Acids*, Wiley, 1986.
- J. Cavanagh, W. J. Fairbrother, A. G. Palmer III, N. J. Skelton & M. Rance, M. *Protein NMR Spectroscopy. Principles and Practice*, Academic Press, 2006.
- M. Williamson, *How Proteins Work*, Garland, 2012.



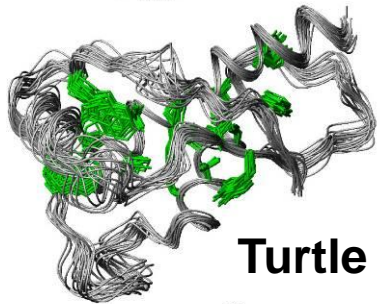
# Prion proteins



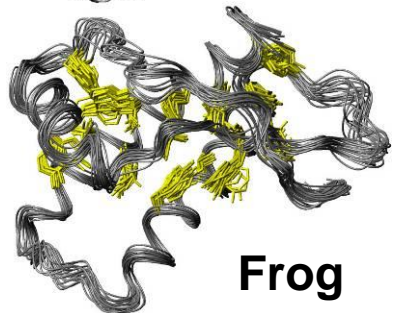
Human



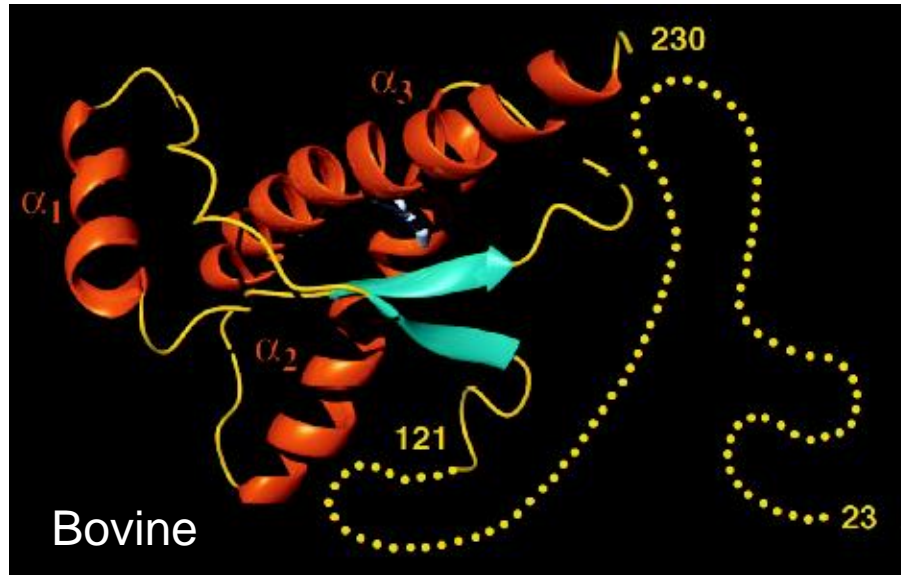
Chicken



Turtle



Frog



Bovine

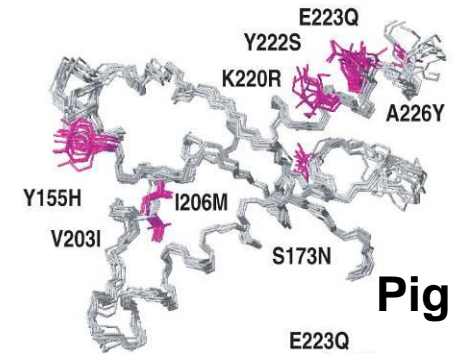
Calzolari, L., Lysek, D. A., Pérez, D. R., Güntert, P., Wüthrich, K. *PNAS* 102, 651-655 (2005).

Lysek, D. A., Schorn, C., Nivon, L. G., Esteve-Moya, V., Christen, B., Calzolari, L., von Schroetter, C., Fiorito, F., Herrmann, T., Güntert, P., Wüthrich, K. *PNAS* 102, 640-645 (2005).

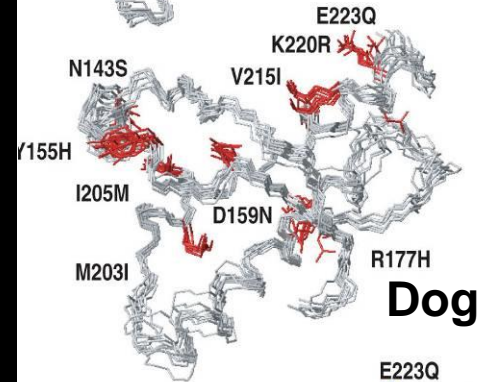
Lühns, T., Riek, R., Güntert, P., Wüthrich, K. *JMB* 326, 1549-1557 (2003).

Zahn, R., Güntert, P., von Schroetter, C., Wüthrich, K. *JMB* 326, 225-234 (2003).

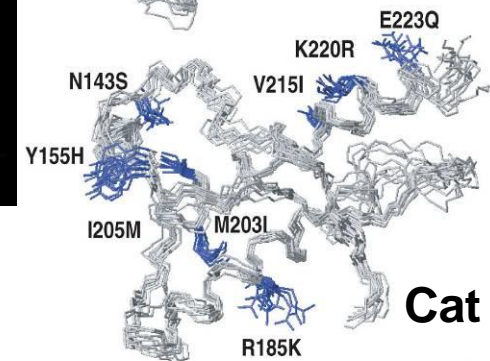
Calzolari, L., Lysek, D. A., Güntert, P., von Schroetter, C., Riek, R., Zahn, R., Wüthrich, K. *PNAS* 97, 8340-8345 (2000).



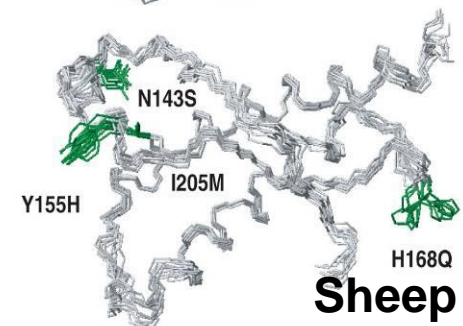
Pig



Dog

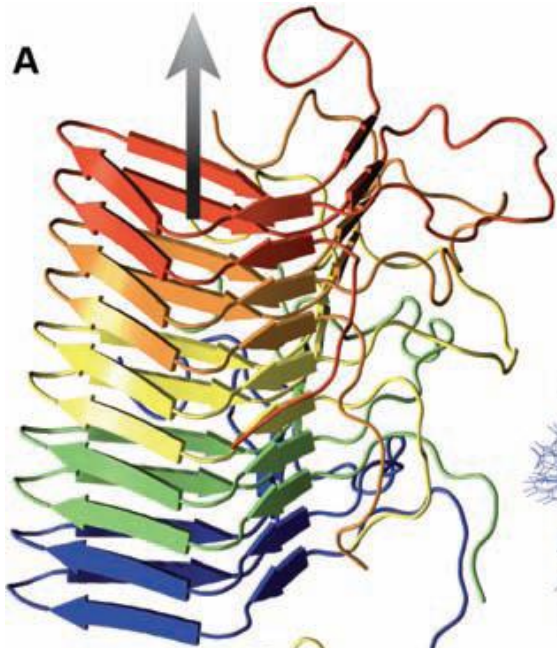
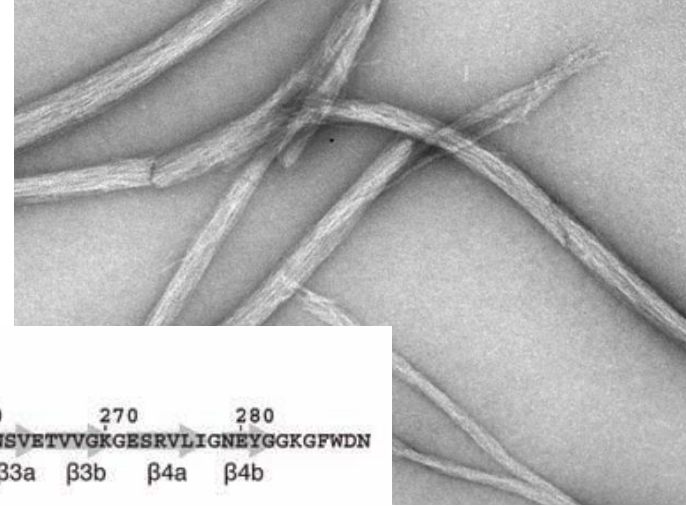


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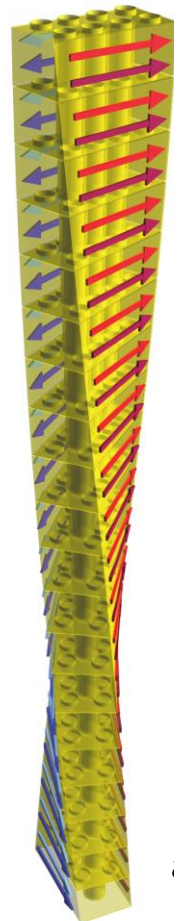
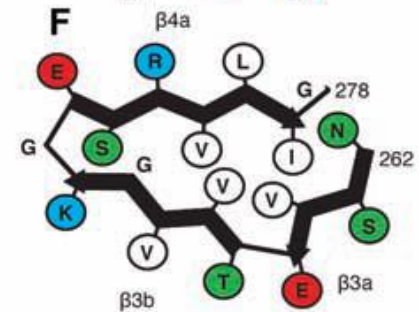
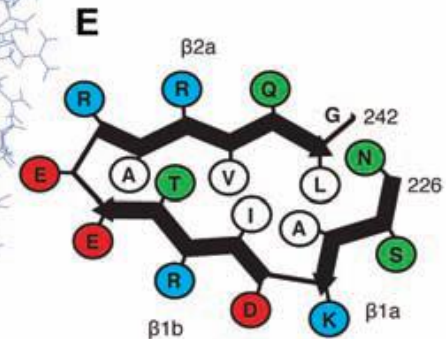
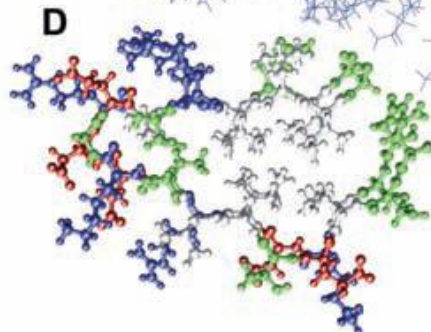
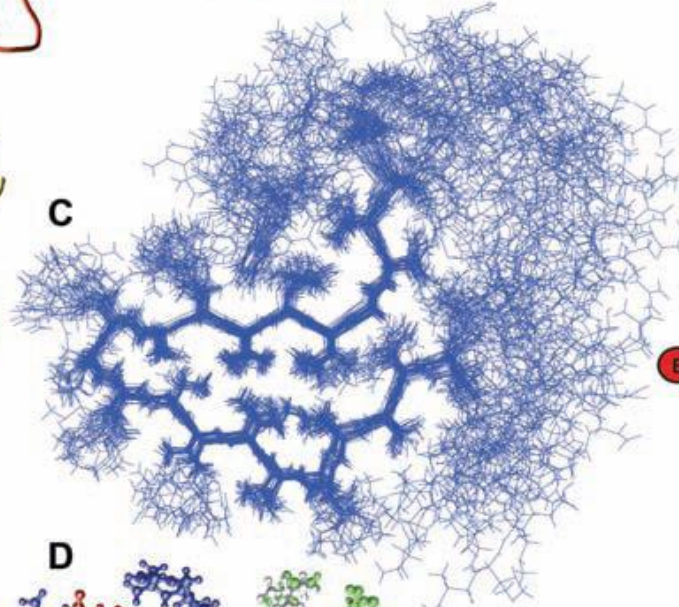
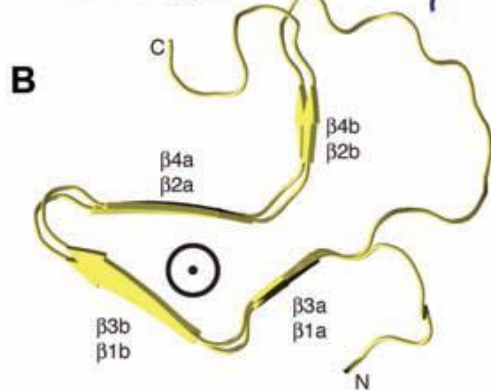


Sheep

# Structure of HET-s prion amyloid fibrils

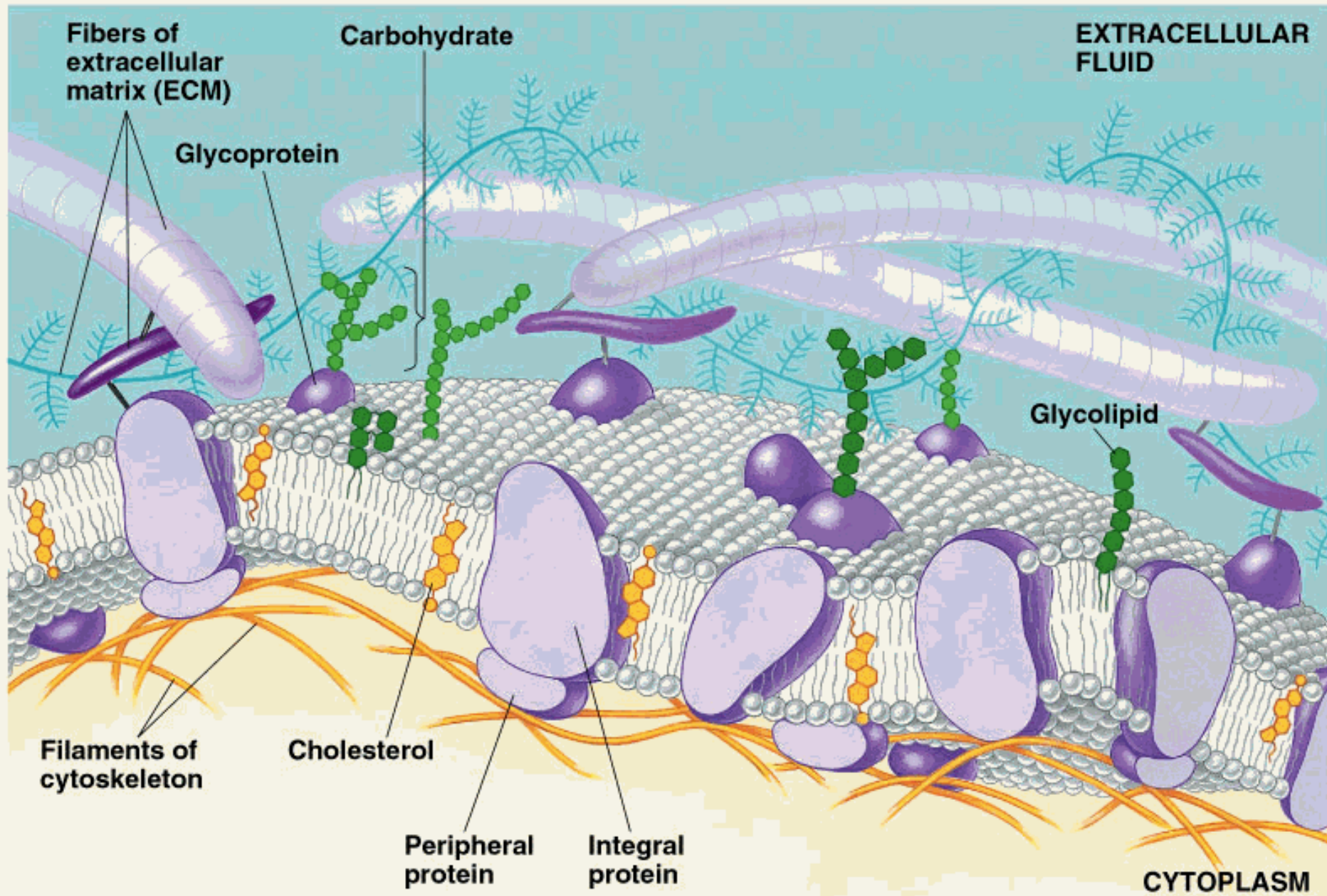


220 230 240 250 260 270 280  
 K I D A I V G R N S A K D I R T B E R A R V Q L G N V V T A A A L H G G I R I S D Q T T N S V E T V V G K G E S R V L I G N E Y G G K G F W D N  
 β1a β1b β2a β2b β3a β3b β4a β4b

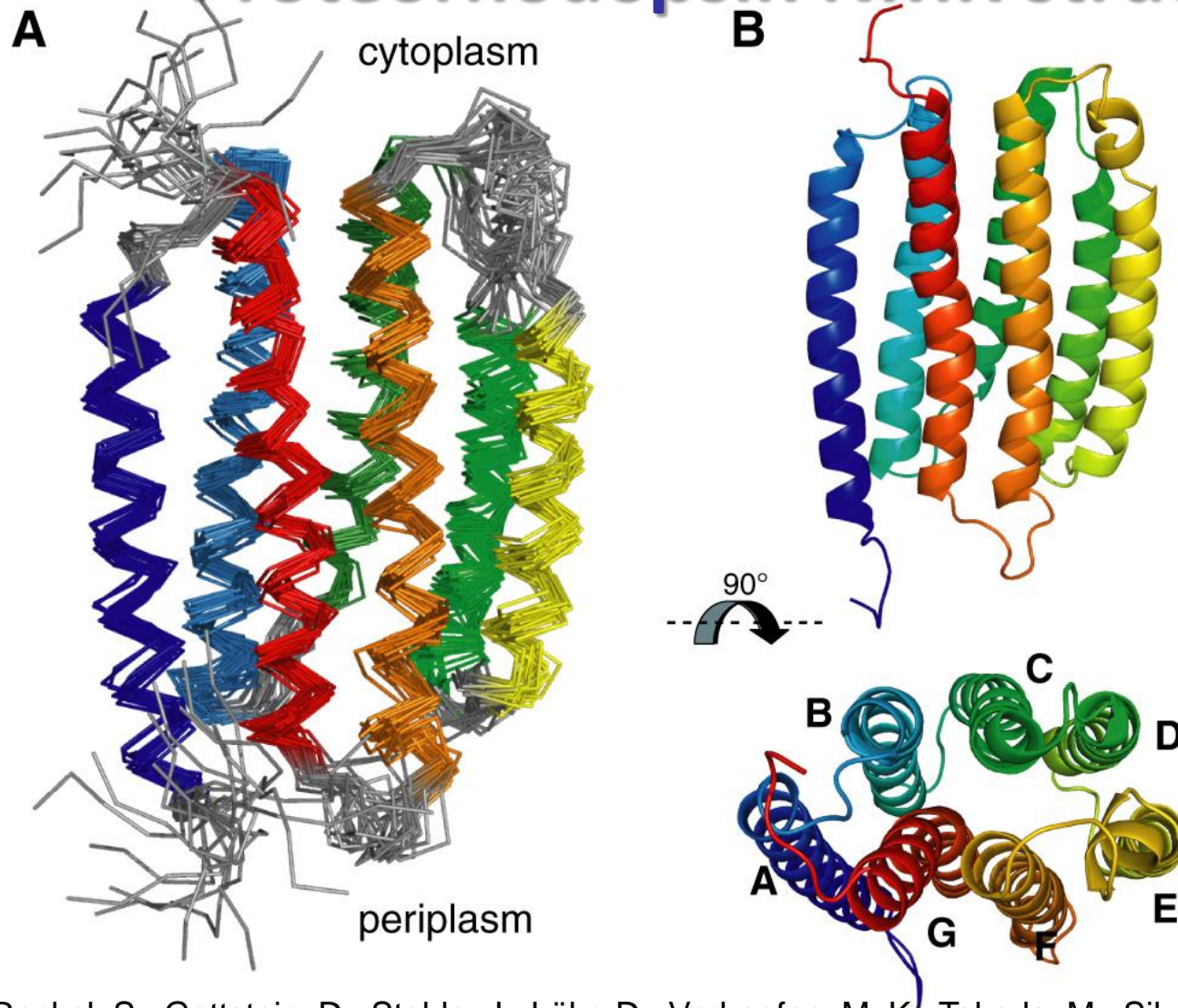


C. Wasmer et al. *Science* **319**, 1523-1526 (2008).

# Membrane proteins



# Membrane protein structure determination: Proteorhodopsin NMR structure



**Fig. 2.** Structure of PR. (A) Bundle of the 20 conformers with lowest CYANA target function obtained from structure calculation. Helices are color-coded from helix A in dark blue to helix G in red. (B) Cartoon representation of the conformer with the lowest CYANA target function seen from the side and from the top. In the lower panel helices are additionally labeled A-G.

Reckel, S., Gottstein, D., Stehle, J., Löhr, D., Verhoefen, M. K., Takeda, M., Silvers, R., Kainosho, M., Glaubitz, C., Wachtveitl, J., Bernhard, F., Schwalbe, H., Güntert, P. & Dötsch, V., *Angew. Chem.* (2011).

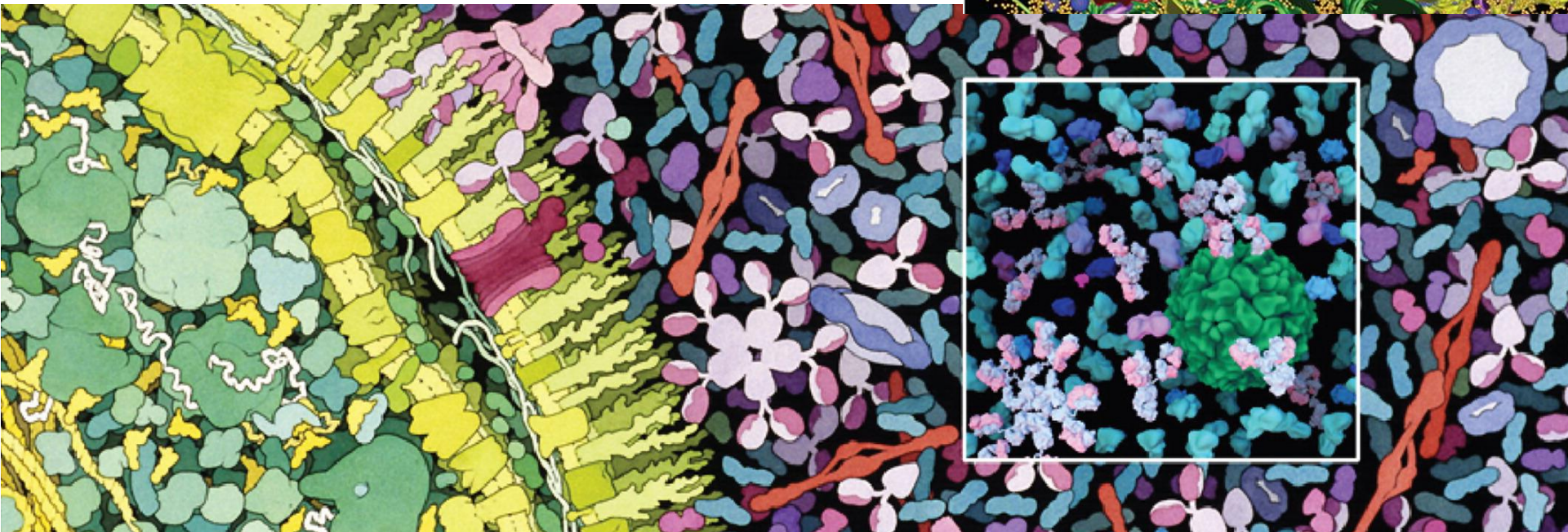


# Cellular interior

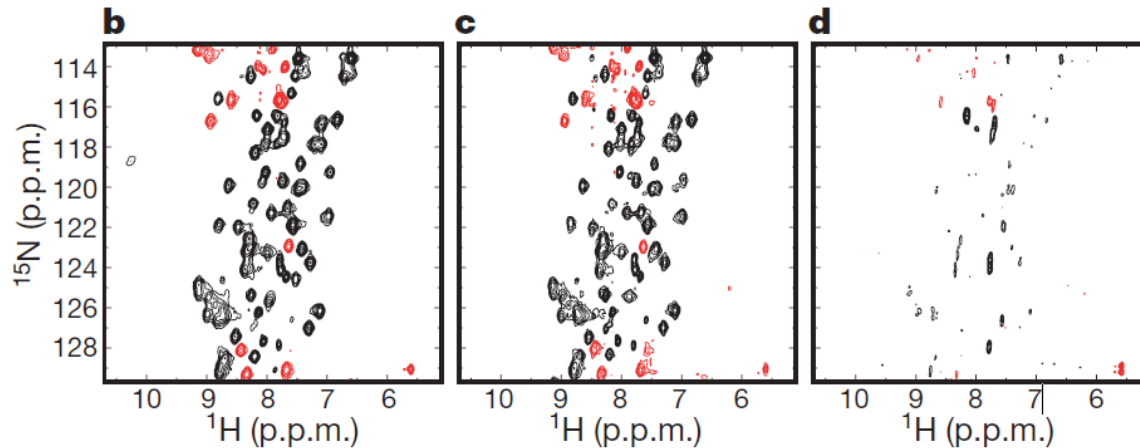
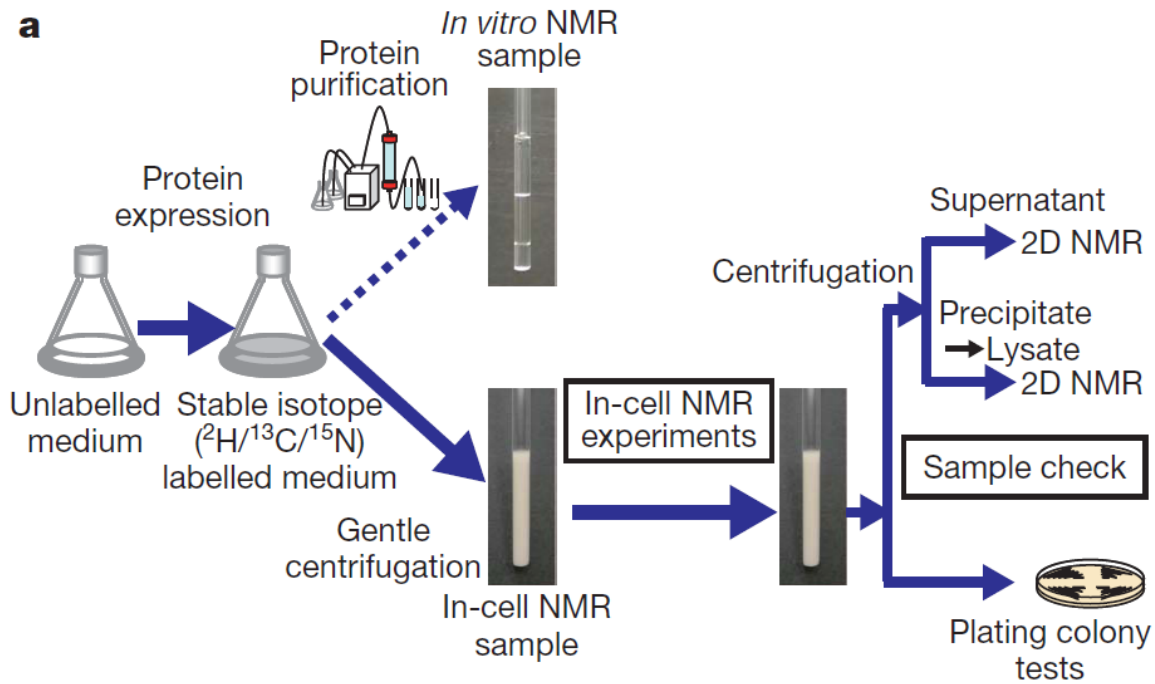
3D model of a cryo-electron tomography image of the Golgi region of an insuline-secreting HIT-T15 cell. The Golgi complex with its cisternae is shown in the center.

Artistic representation of an *E. coli* cell (cellular interior in light green, cell membrane in yellow) in blood serum (pink to violet). The inset is a 3D model created from experimentally determined protein structures. Serum albumin is shown in turquoise. Y-shaped molecules and the large complex at lower left are antibodies. A poliovirus particle is depicted in green.

Y. Ito & P. Selenko. Cellular structural biology. Curr. Opin. Struct. Biol. 20, 640–648 (2010)



# In-cell NMR structure determination

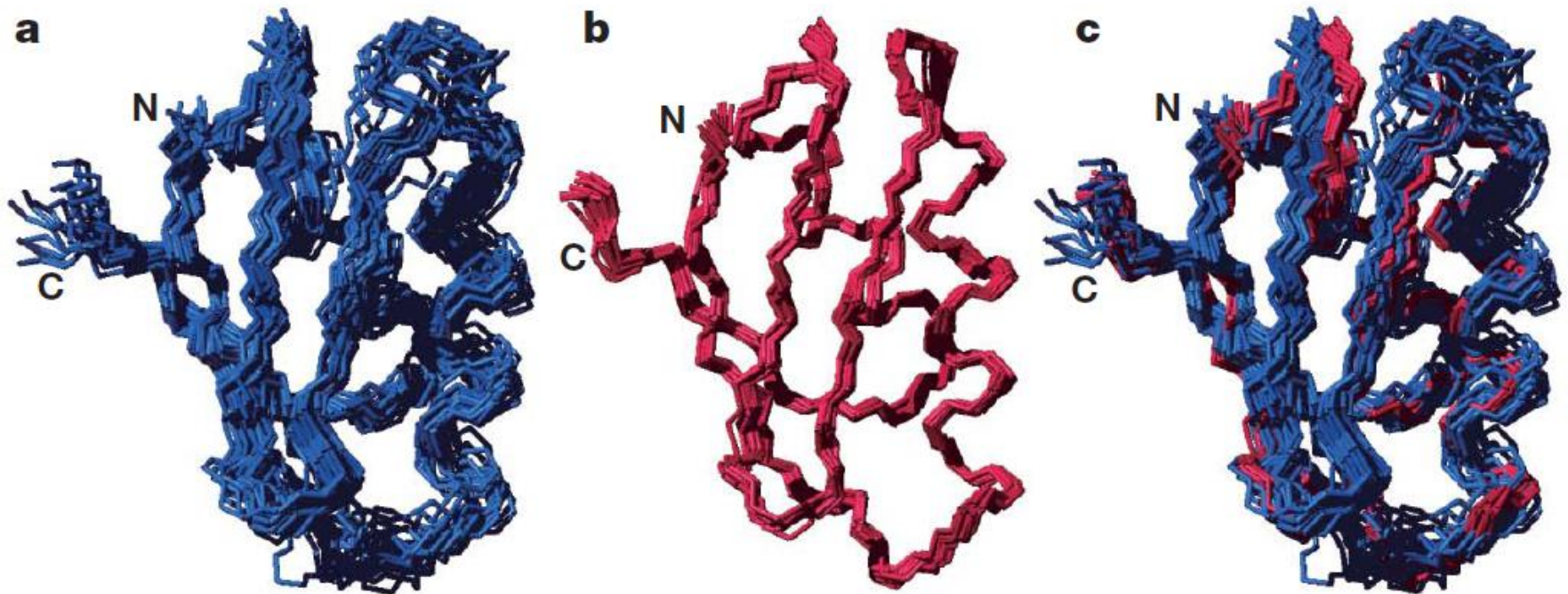


**Figure 1 | Stability of *E. coli* cells expressing TTHA1718 under NMR measurement conditions.** **a**, Scheme of the in-cell NMR experiments using *E. coli* cells. **b**, The  $^1\text{H}$ - $^{15}\text{N}$  HSQC spectrum of a TTHA1718 in-cell NMR sample immediately after sample preparation. **c**, The  $^1\text{H}$ - $^{15}\text{N}$  HSQC spectrum after 6 h in an NMR tube at 37  $\mu\text{C}$ . **d**, The  $^1\text{H}$ - $^{15}\text{N}$  HSQC spectrum of the supernatant of the in-cell sample used in **b** and **c**.

Yutaka Ito  
Tokyo Metropolitan University

Sakakibara *et al.*,  
*Nature* 458, 102-105 (2009)

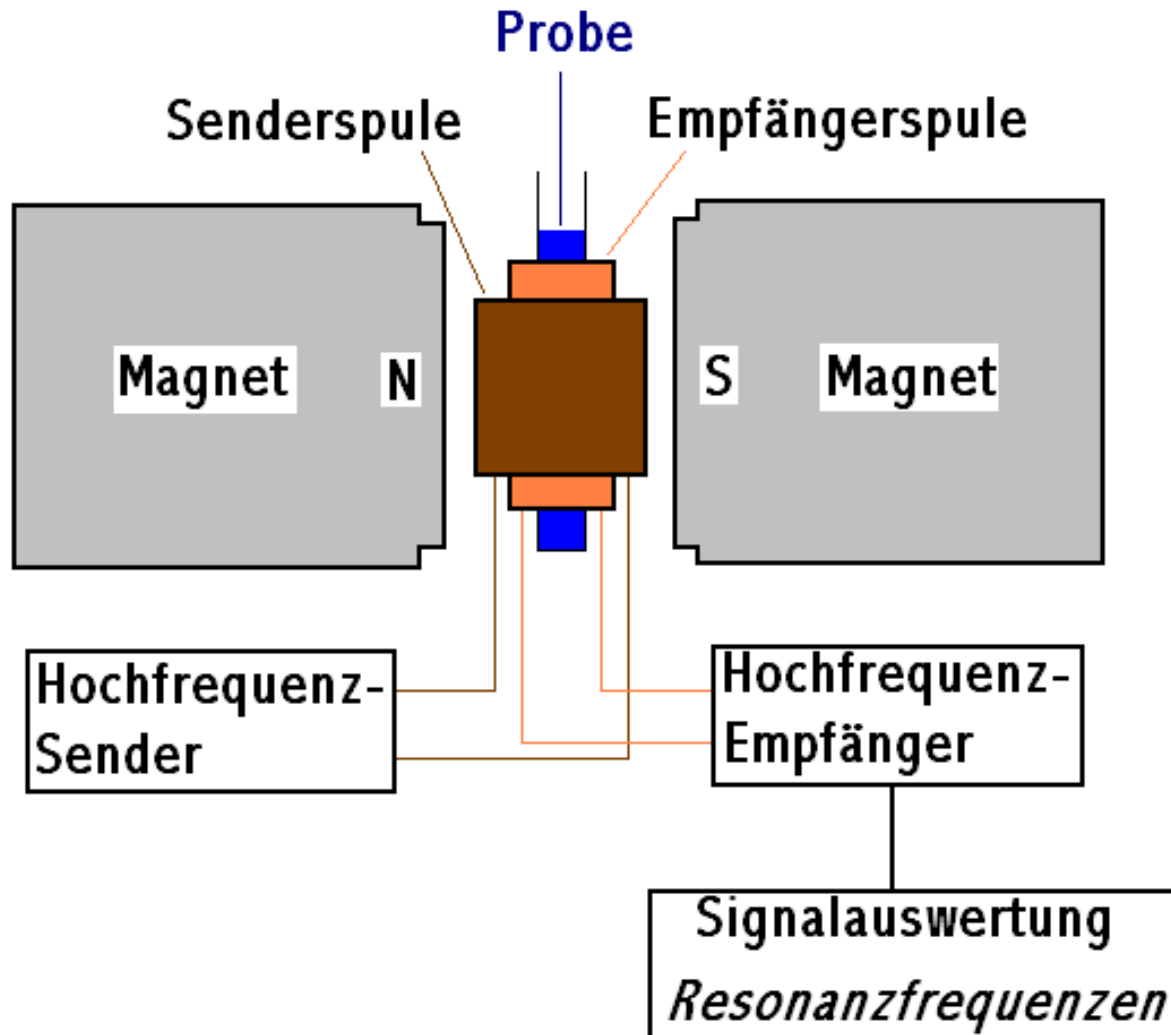
# In-cell NMR structure of TTHA1718



**Figure 4 | NMR solution structure of TTHA1718 in living *E. coli* cells.** **a**, A superposition of the 20 final structures of TTHA1718 in living *E. coli* cells, showing the backbone (N, C $\alpha$ , C') atoms. **b**, A superposition of the 20 final structures of purified TTHA1718 *in vitro*. **c**, A comparison of TTHA1718 structures in living *E. coli* cells and *in vitro*. The best fit superposition of backbone (N, C $\alpha$ , C') atoms of the two conformational ensembles are shown

Sakakibara *et al.*, *Nature* 458, 102-105 (2009)

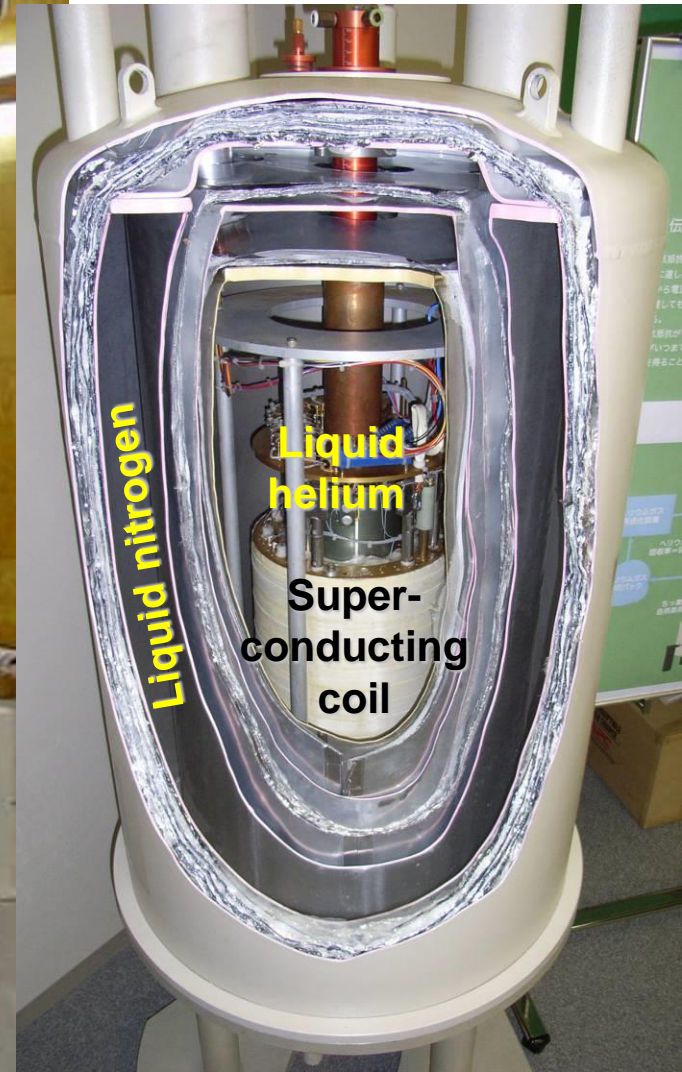
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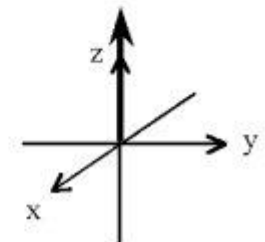
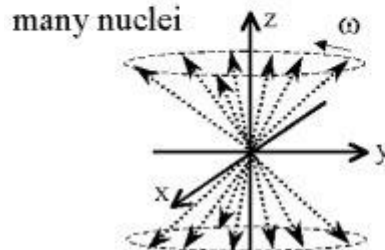
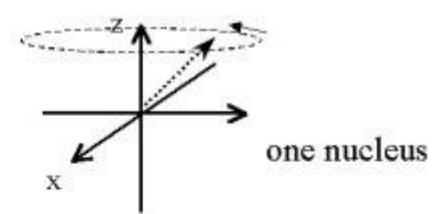
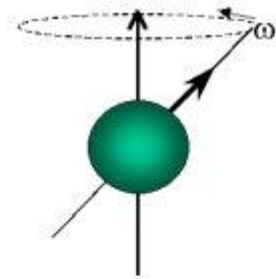
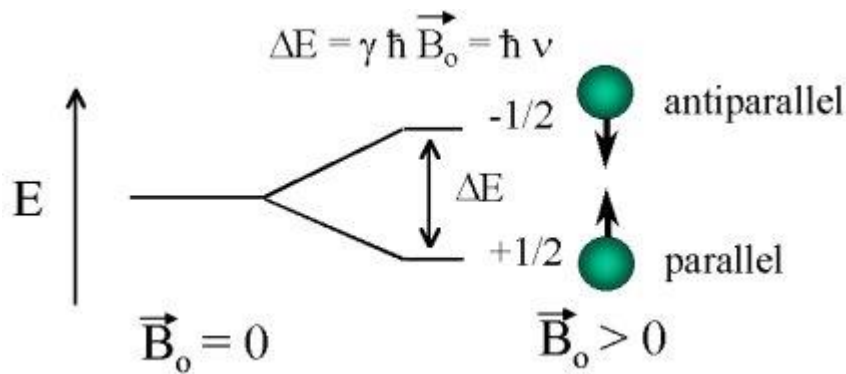
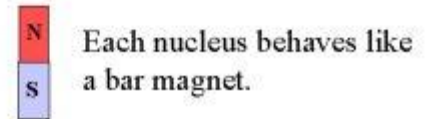
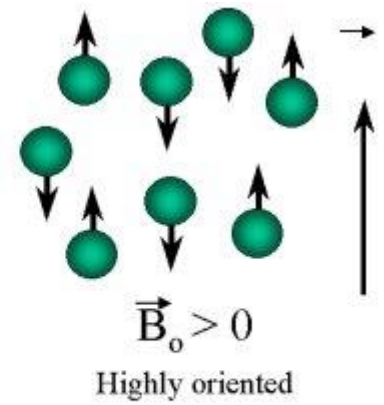
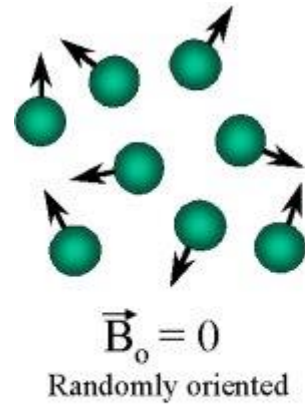
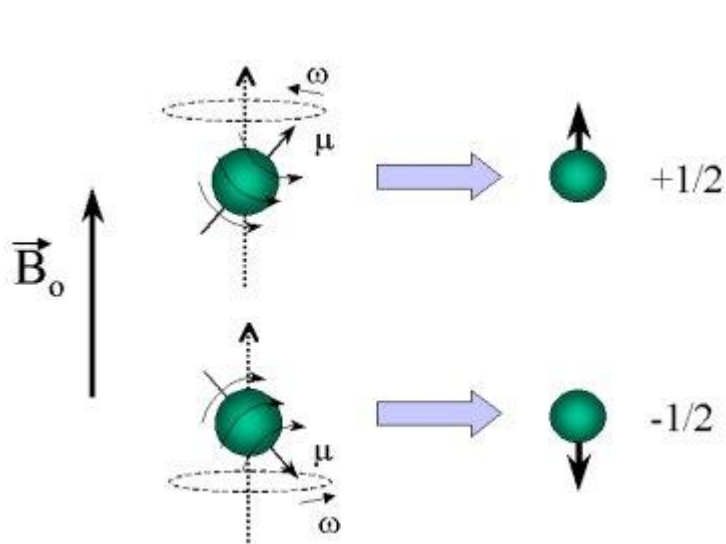
# NMR Spectrometer



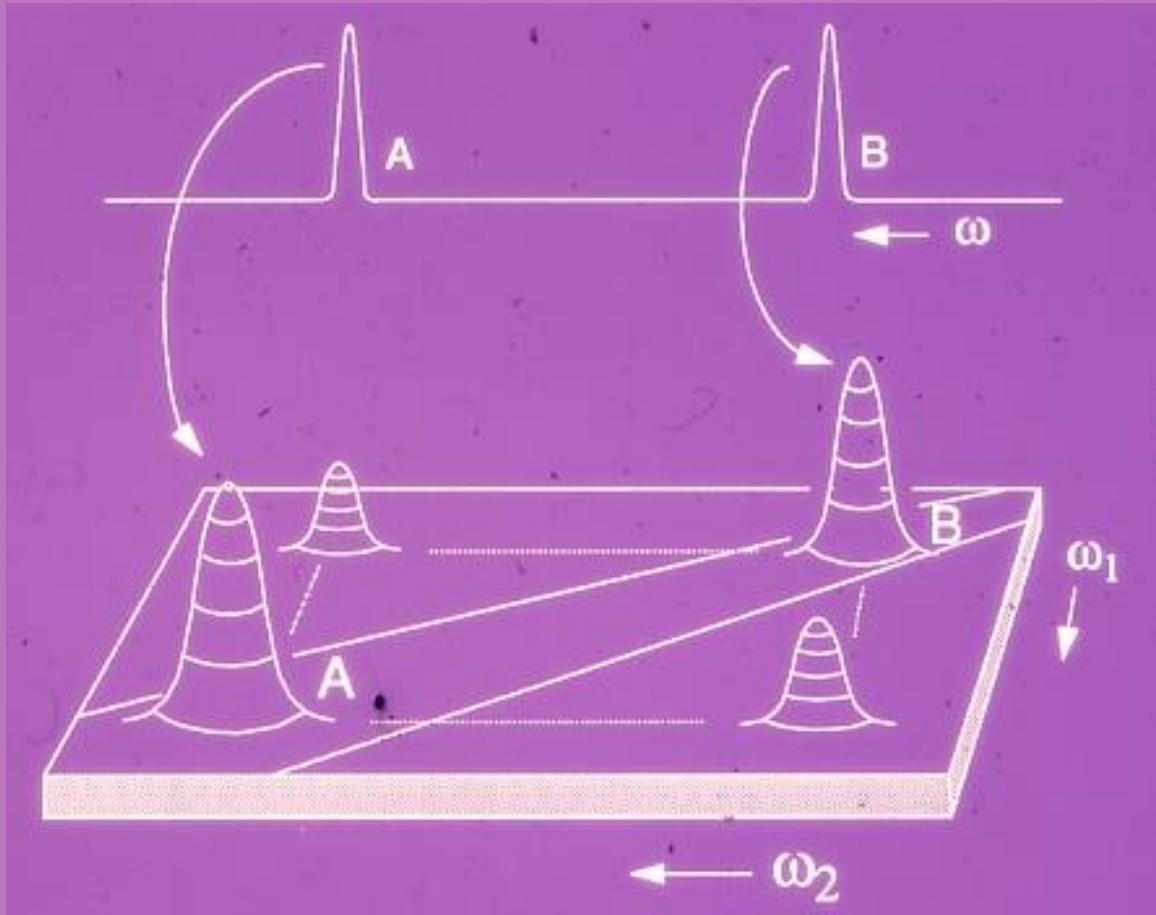
900 MHz NMR spectrometer (RIKEN, Yokohama)



# Kernspins im Magnetfeld



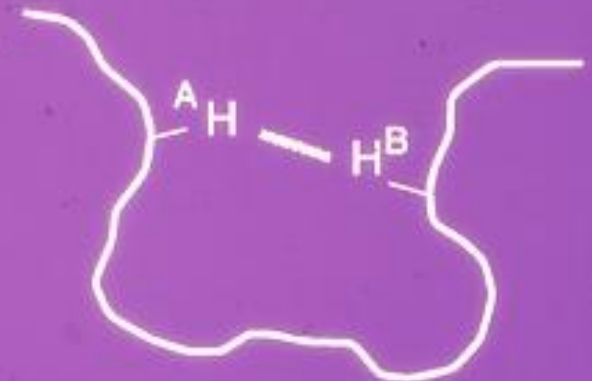
# 2D NMR Spectra



through-bond

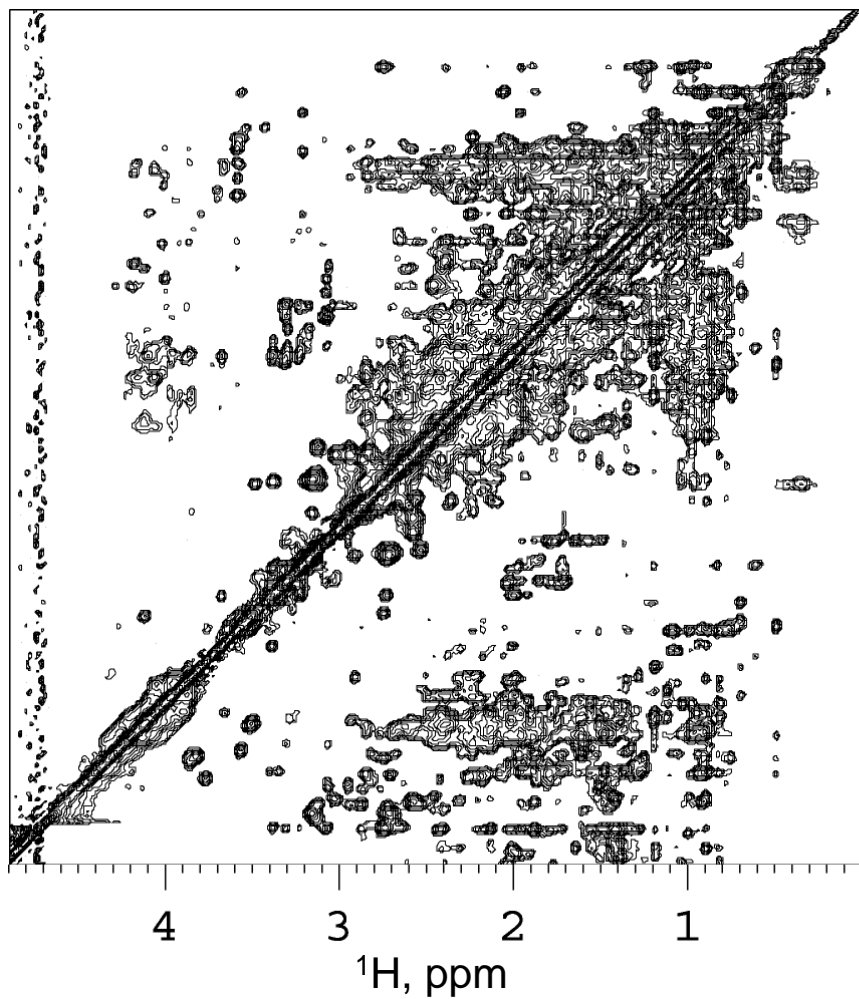


through-space

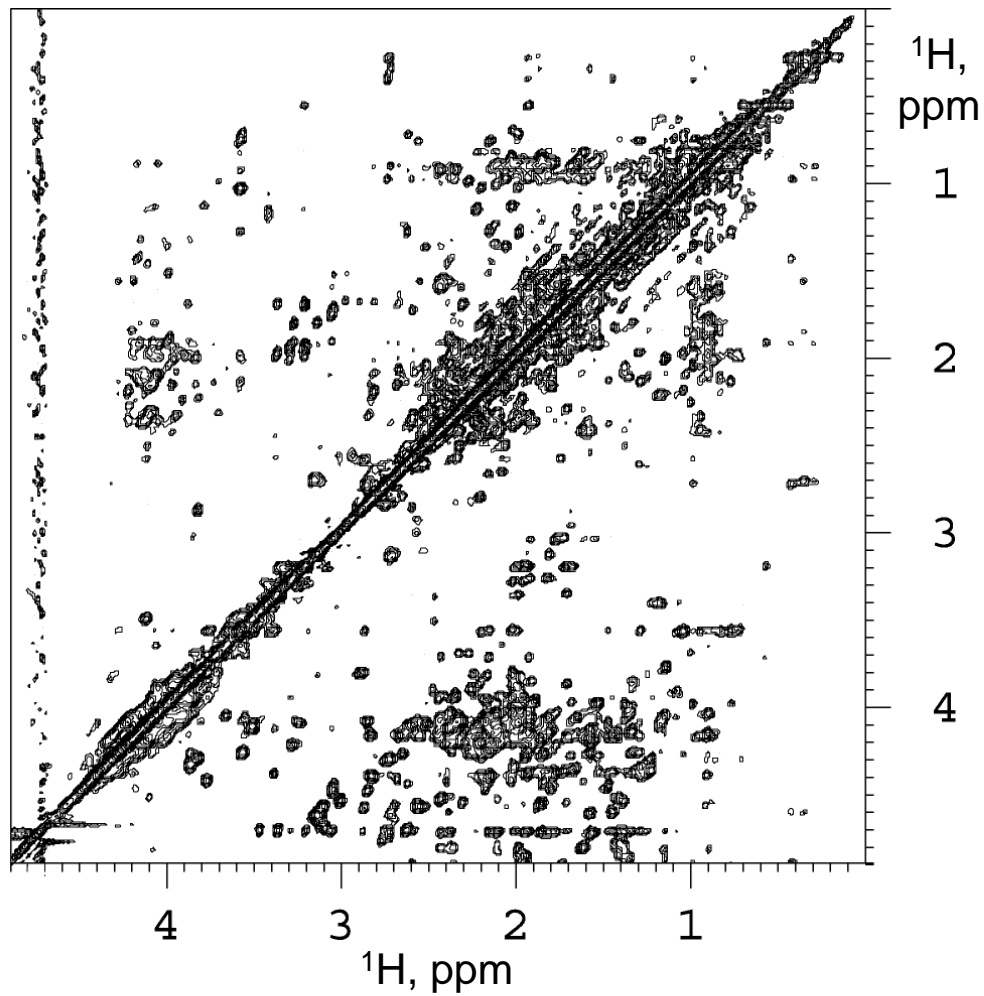


# Calmodulin NOESY spectra

uniformly labelled



SAIL

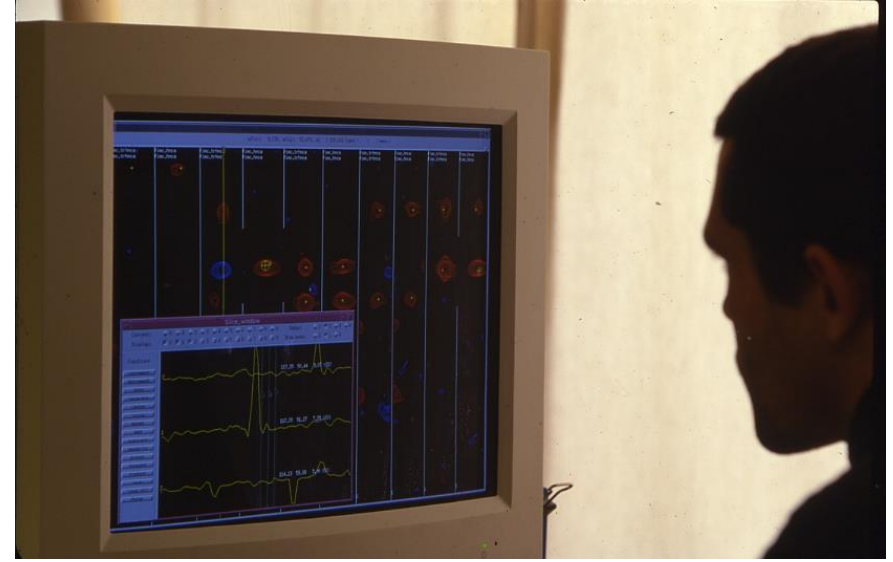




# NMR Spektrenauswertung



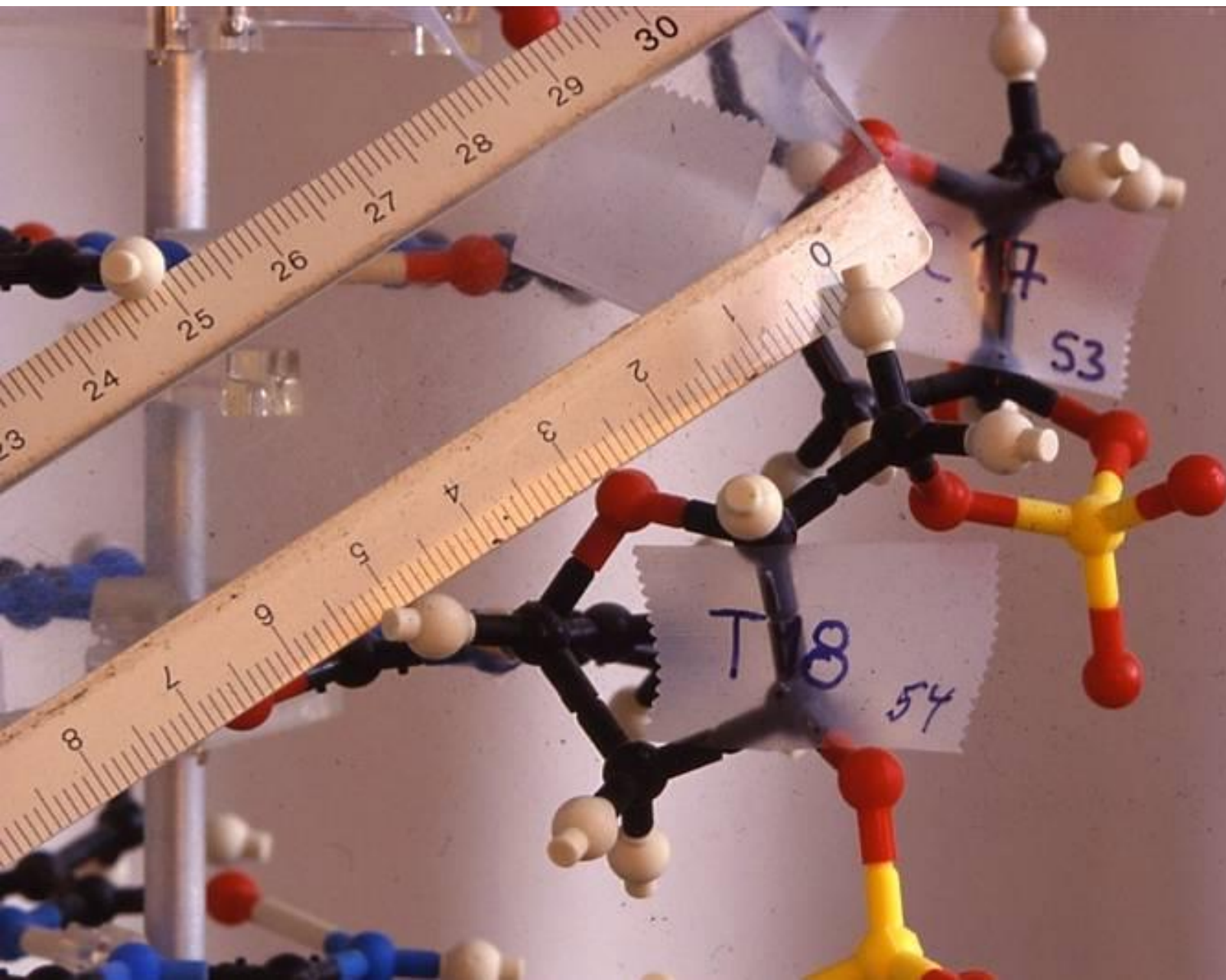
**Manuell**



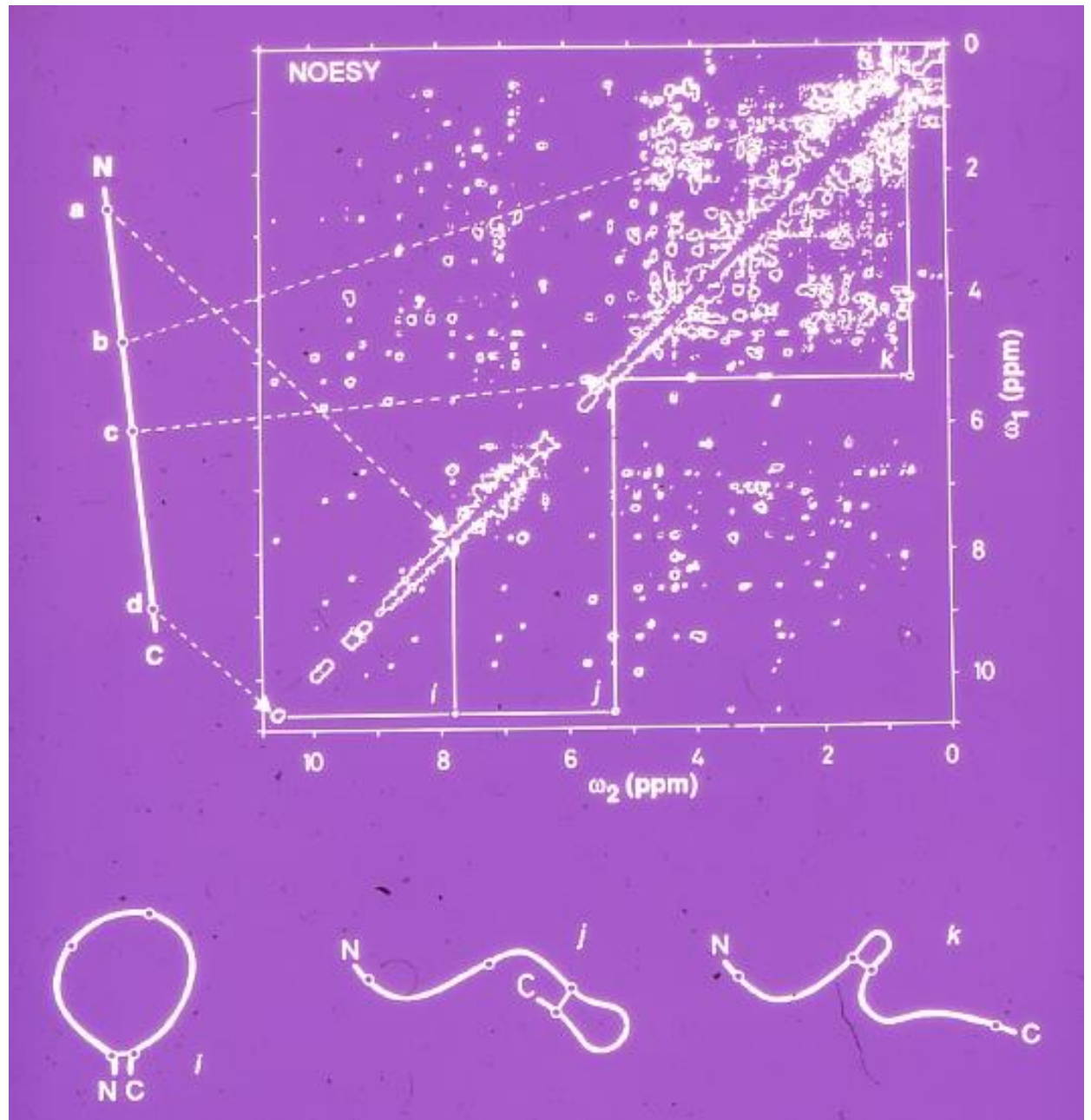
**Interaktiv**

**Automatisch**

# NMR measures distances between atoms



# NOESY Spektrum



# Konformationsdaten aus NMR Messungen

1. Nuclear Overhauser Effects (NOEs)
  2.  $^3J$  skalare Kopplungen
  3. H-Brücken
  4. Chemische Verschiebungen
  5. Residuelle dipolare Kopplungen (RDC)
- ...

## Experimental data Systems

- NOEs
  - Hydrogen bonds
  - Paramagnetic relaxation enhancement
  - ambiguous NOEs; docking (HADDOCK)
  - “exact” NOEs (eNOEs)
- Chemical shifts (TALOS)
  - Scalar coupling constants
  - Ramachandran plot; rotamers
- $^3J$  scalar coupling constants
- Partially aligned proteins
- Paramagnetic proteins
- Partially aligned proteins
- Known size, shape
- Symmetric multimers; fibrils
- Symmetric multimers; fibrils
- Energy refinement

## Conformational restraints in CYANA

- Distance restraints
  - exact distances
  - upper bounds, lower bounds
  - ambiguous distance restraints
  - ensemble-averaged restraints
- Torsion angle restraints
  - single torsion angles
  - multiple torsion angles
- $^3J$  scalar coupling constants
- Residual dipolar couplings (RDC)
- Pseudocontact shifts (PCS)
- Chemical shift anisotropy (CSA)
- Radius of gyration restraints
- Multimer identity restraints
- Multimer symmetry restraints
- AMBER force field

# NOE (Nuclear Overhauser Effect)

NMR Daten: Integral  $V$  von NOESY Kreuzsignalen

Konformationsdaten: obere Schranken für  $^1\text{H}$ - $^1\text{H}$  Distanzen,  $d$

Fuer isoliertes Spinpaar im starren Molekül:

$$V = C/d^6 \text{ mit } C = \text{konstant}$$

Eigenschaften:

- nur kurze Distanzen  $< 5 \text{ \AA}$  messbar
- dichtes Netzwerk bzgl. der Sequenz kurz- und langreichweitiger Distanzschranken
- viele  $^1\text{H}$  Atome im Molekül  $\rightarrow$  "Spindiffusion"
- interne Bewegungen  $\rightarrow$  nicht-lineare Mittelung
- Bestimmung von  $C$ ?
- Überlapp  $\rightarrow$  mehrdeutige Zuordnung, verfälschte Integrale

# NOE distance restraints → Protein structure



Periplasmic chaperone  
FimC (205 residues)

1967 NOE upper distance limits

# ${}^3J$ skalare Kopplungen

NMR Daten: Aufspaltung eines Signals

Konformationsdaten: Einschränkungen von Torsionswinkeln,  $\theta$

Karplus-Kurve:  ${}^3J(\theta) = A \cos^2 \theta + B \cos \theta + C$   
mit empirischen Konstanten  $A, B, C$

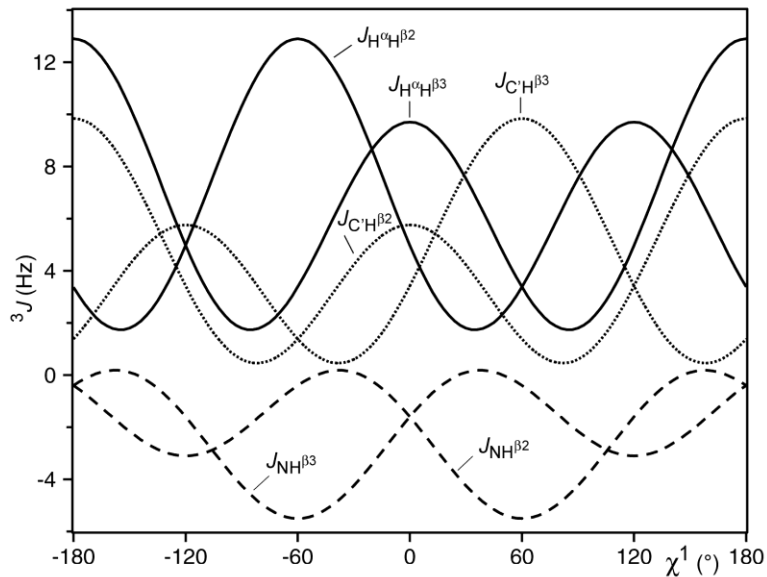
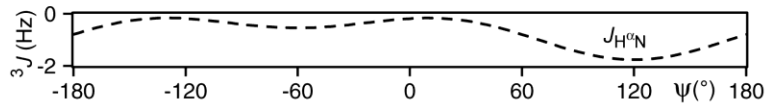
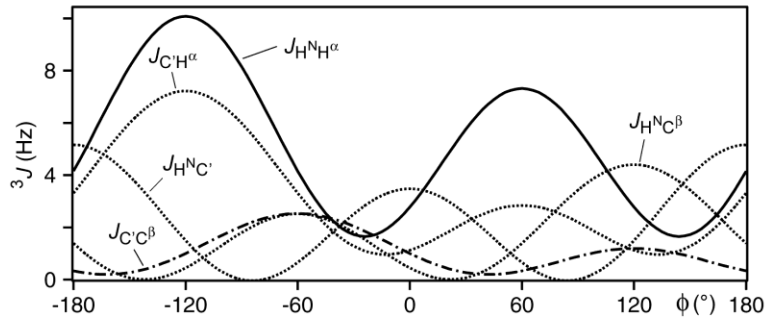
Zum Beispiel:  ${}^3J_{\text{H}\text{N}\text{H}\alpha}(\phi)$ ,  ${}^3J_{\text{H}\alpha\text{H}\beta}(\chi^1)$

Eigenschaften:

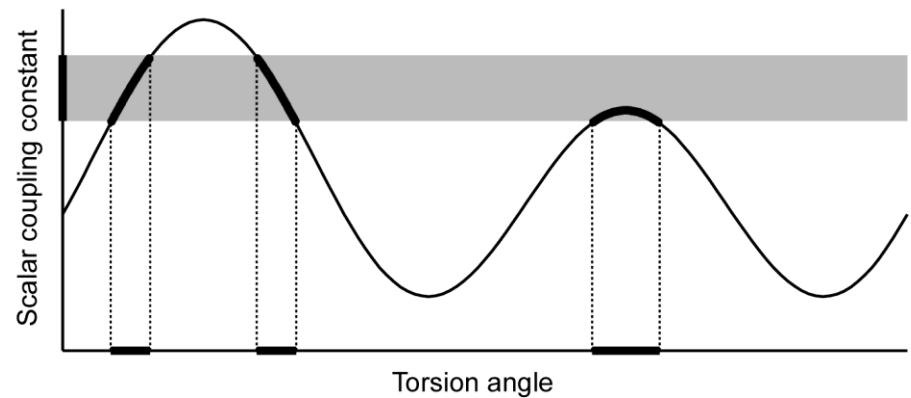
- Information nur über lokale Konformation
- mehrdeutige Beziehung  ${}^3J \leftrightarrow \theta$



# $^3J$ skalare Kopplungen



- $^3J(\theta) = A \cos^2 \theta + B \cos \theta + C$
- local information only
- ambiguous relation to torsion angle



# H-Brücken

NMR Daten: langsamer  $^1\text{H} \rightarrow ^2\text{H}$  Austausch + NOEs

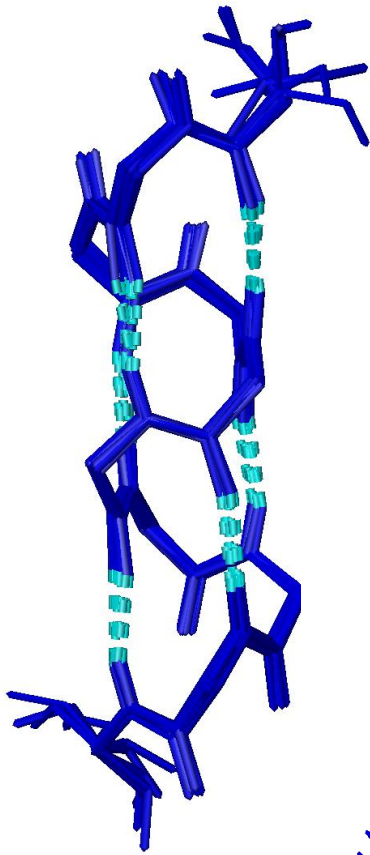
Konformationsdaten: Donor-Akzeptor Distanz

Typische H-Brücken:  $-\text{N}-\text{H} \cdots \text{O}=\text{C}-$  in regulären Sekundärstrukturen (Helices,  $\beta$ -Blätter)

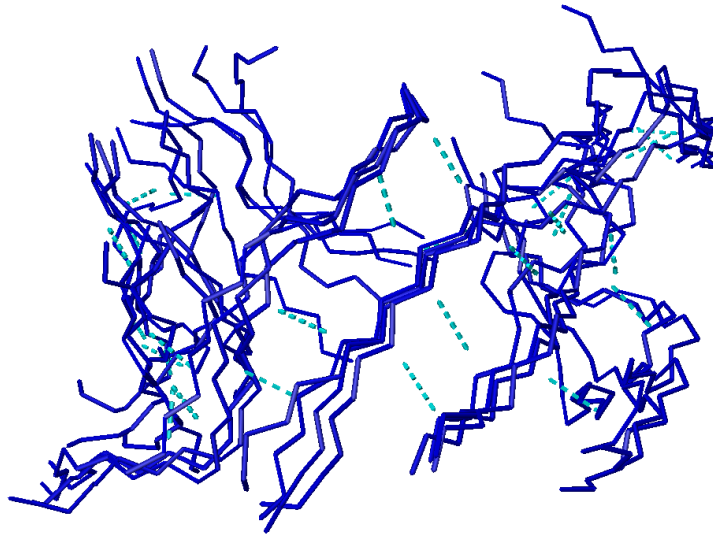
Eigenschaften:

- Bzgl. Sequenz mittel- und langreichweitig
- Donor (H) identifizierbar
- Akzeptor (O) nur indirekt bestimmbar (benachbarte NOEs + Annahmen über Sekundärstruktur)

# Impact of hydrogen bond restraints



Structures of an  $\alpha$ -helix and a  $\beta$ -barrel calculated only with H-bond constraints



- Strong impact on structure
- Direct detection of H-bonds by NMR is possible, but not sensitive
- Without identification of acceptor atom  $\approx$  assumption on secondary structure

# Chemische Verschiebungen

NMR Daten: chem. Verschiebungen,  $\delta$

Konformationsdaten:  $(\phi, \psi)$  Torsionswinkelbereiche

Komplexe Beziehung:  $\delta \leftrightarrow (\phi, \psi)$

Eigenschaften:

- einfache Messung
- $(\phi, \psi)$ -Werte aus Datenbank von Proteinen mit bekannter Struktur und chem. Verschiebungen (TALOS)
- Information nur über lokale Konformation

# Three principal challenges of NMR protein structure analysis

## 1. Efficiency

Spectrum analysis requires (too) much time and expertise.

## 2. Size limitation

Structures of proteins > 30 kDa are very difficult to solve.

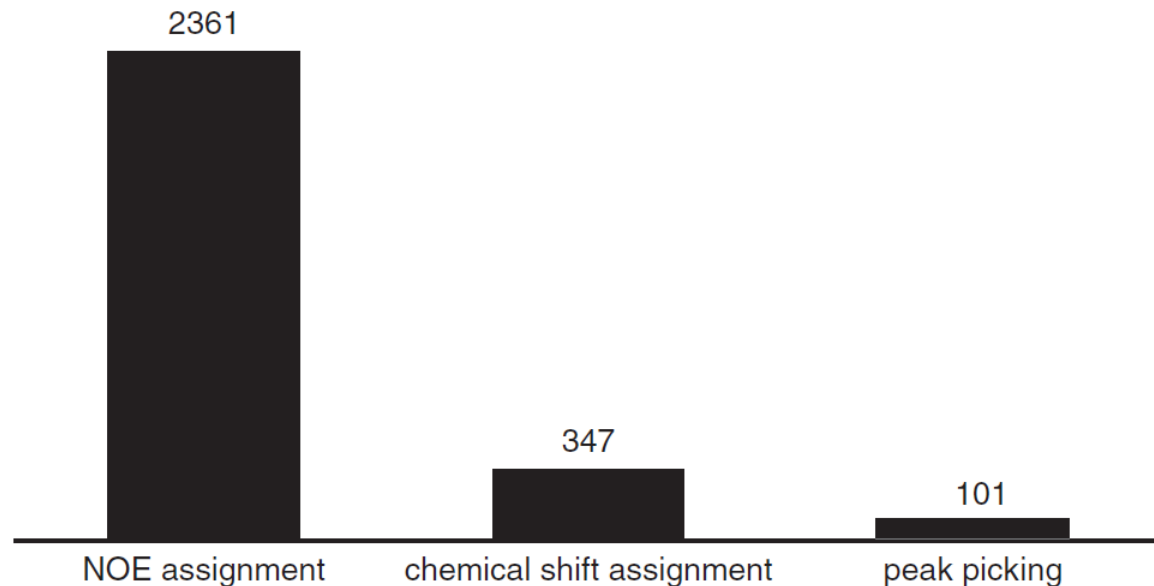
## 3. Objectivity

Agreement between structure and raw NMR data?

# Computational tasks in NMR structure determination

Peak picking	→	Signal frequencies
Shift assignments	→	Spin frequencies
NOESY assignment	→	Structural restraints
Structure calculation	→	3D structure
Refinement, validation	→	Final structure

# Use of automation for different stages of PDB NMR structures



**Fig. 4.** The use of automation – in terms of PDB depositions – for the different stages of the traditional protocol for NMR protein structure determination. The histograms represent the number of structures returned when searching the PDB for one of the programs published for the respective stages. Exact search strings can be found in the Appendix (Tables A1, A2 and A3).

# Computational tasks in NMR structure determination

**Peak picking** → **Signal frequencies**

Shift assignments → Spin frequencies

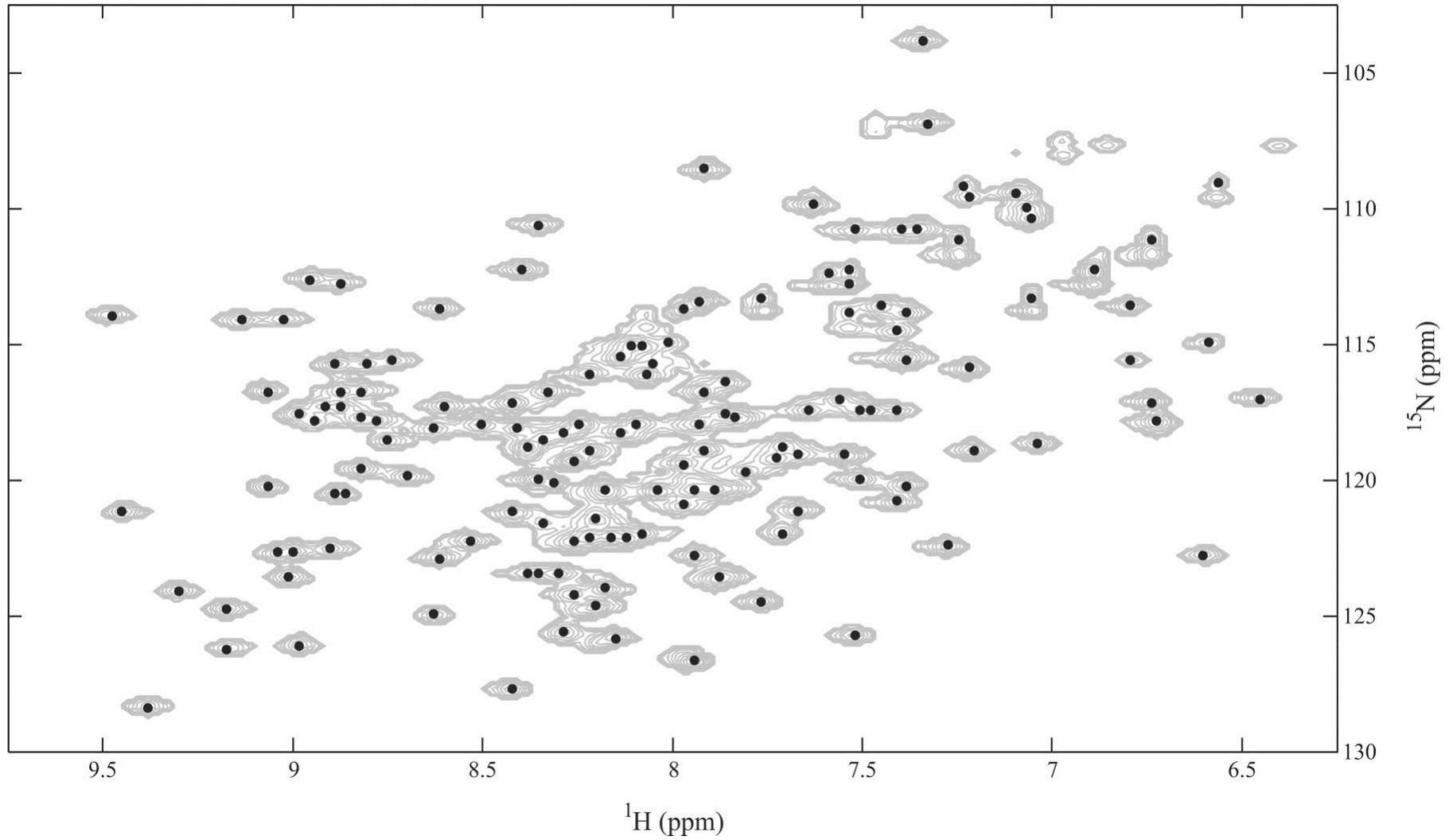
NOESY assignment → Structural restraints

Structure calculation → 3D structure

Refinement, validation → Final structure



# Peak picking



# Automatically picked peaks for the protein ENTH

Spectrum	Expected peaks	Measured peaks [%]	Missing peaks [%]	Artifact peaks [%]	Deviation
<sup>15</sup> N-HSQC	164	138	14	58	0.138
<sup>13</sup> C-HSQC	685	113	12	51	0.434
HNCO	134	150	12	63	0.308
HN(CA)CO	269	74	35	16	0.449
HNCA	274	116	18	39	0.331
HN(CO)CA	134	150	10	61	0.395
CBCANH	529	112	29	47	0.458
CBCA(CO)NH	270	149	13	63	0.405
HBHA(CO)NH	365	134	35	75	0.510
(H)CC(CO)NH	451	88	34	25	0.530
H(CCCO)NH	664	56	57	21	0.673
HCCH-COSY	2469	97	66	70	0.609
(H)CCH-TOCSY	2449	136	45	93	0.568
HCCH-TOCSY	3574	44	66	20	0.632
<sup>15</sup> N-edited NOESY	1776	120	47	74	0.486
<sup>13</sup> C-edited NOESY	5958	144	48	103	0.495
<b>Total</b>	<b>20165</b>	<b>99</b>	<b>49</b>	<b>69</b>	<b>0.524</b>

**Missing peaks:** Percentage of expected peaks that cannot be mapped to a measured peak using the manually determined reference chemical shifts. **Artifact peaks:** Percentage of measured peaks to which no expected peak can be mapped. All percentages are relative to the number of expected peaks. **Deviation:** Root-mean-square deviation between the chemical shift position coordinates of the measured peaks to which an expected peak can be mapped and the corresponding reference chemical shift value, normalized by the chemical shift tolerances of 0.03 ppm for <sup>1</sup>H and 0.4 ppm for <sup>13</sup>C and <sup>15</sup>N.

# Computational tasks in NMR structure determination

- Peak picking → Signal frequencies
- Shift assignments** → **Spin frequencies**
- NOESY assignment → Structural restraints
- Structure calculation → 3D structure
- Refinement, validation → Final structure

**NMR resonance assignment  
is like solving a puzzle...**

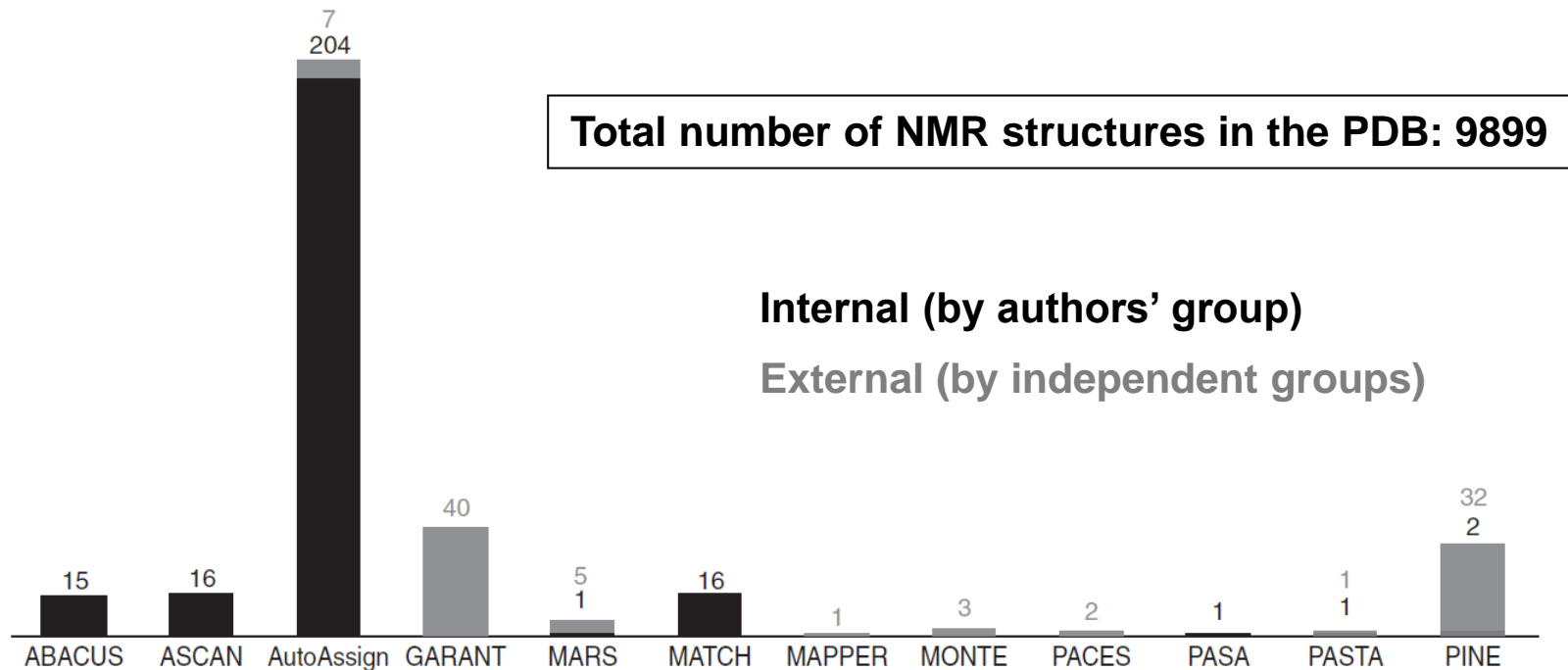
**...with missing pieces  
(incomplete signals)**



**...with additional pieces  
(artifacts)**

**...in the mist  
(low signal-to-noise,  
line-broadening)**

# Chemical shift assignment software used for PDB NMR structures



**Fig. 8.** Histogram plot of the number of citations from PDB depositions for selected chemical shift assignment programs as of 27 August 2010. Only those programs are listed for which at least one citation was found. Citations from internal depositions are represented in black, whereas those from external use of the program are shown in grey. In this context, we define internal depositions as those for which one or more of the developers appear as a structure author, or which originate from the same structural genomics project in which the program was developed. Note that (Bermejo & Llinás, 2010) count 31 depositions for ABACUS. Exact search strings can be found in the Appendix, Table A1.

# Characteristics of a correct assignment

## a) Shift normality:

Chemical shifts are consistent with general chemical shift statistics.

## b) Alignment:

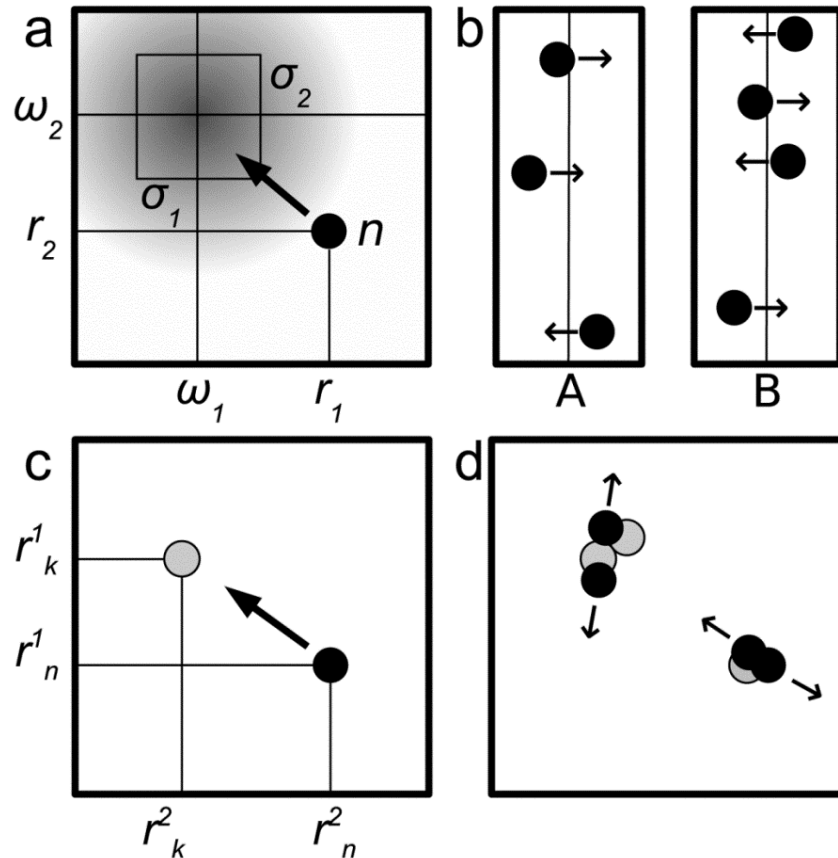
Peaks assigned to the same atom are aligned.

## c) Completeness:

As many peaks as possible are assigned.

## d) Low degeneracy:

The number of degenerate peaks is small.



○ measured peaks

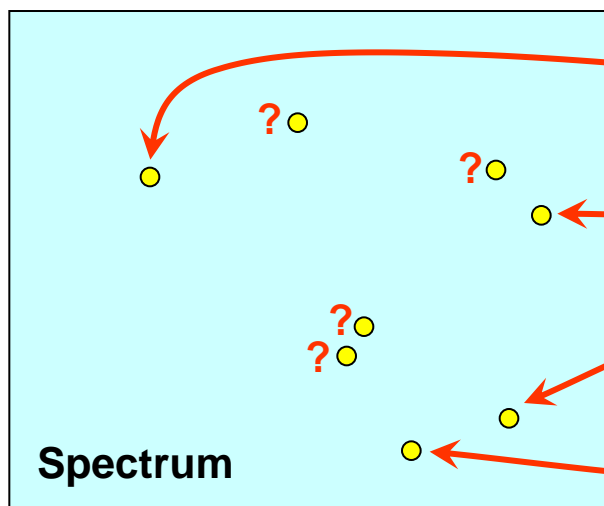
● expected peaks

# FLYA Automated Assignment Algorithm

## Observed peaks

Position known

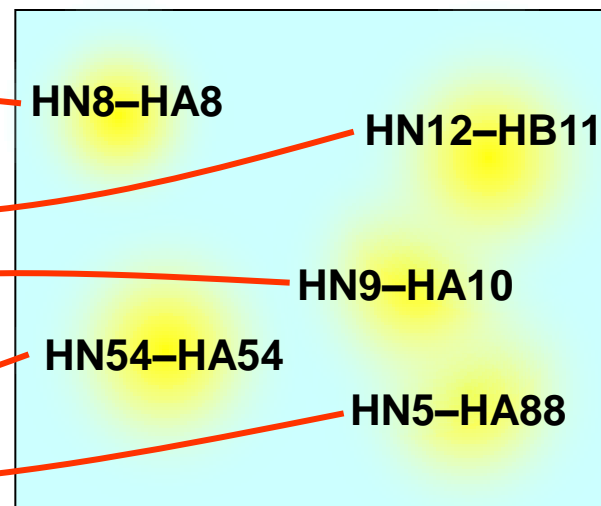
Assignment unknown



## Expected peaks

Assignment known

Position known only approximately



**Assignment** = Find **mapping** between expected and observed peaks.

## Score for assignment

Presence of expected peaks

Alignment of peaks assigned to the same atom

Normality of assigned resonance frequencies

## Optimization of assignment

Evolutionary algorithm combined with local optimization

**Elena Schmidt**

*J. Am. Chem. Soc.* 134, 12817-12829 (2012)

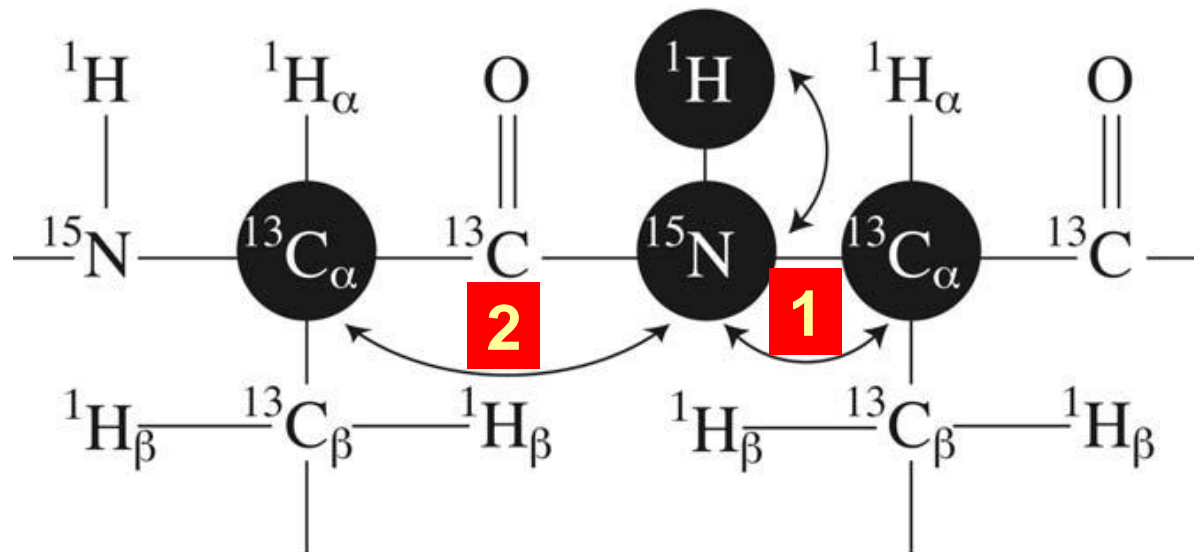
**Christian Bartels et al.**

*J. Comp. Chem.* 18, 139-149 (1997)

*J. Biomol. NMR* 7, 207-213 (1996)

# Generation of expected peaks

## Example: HNCA experiment



Magnetization path entries in CYANA library:

SPECTRUM HNCA

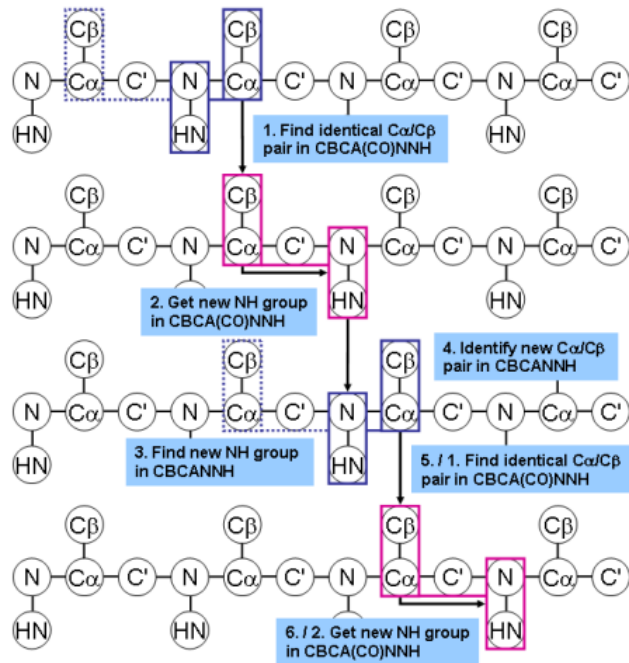
**1** 0.98 H\_AMI N\_AMI C\_ALI

**2** 0.80 H\_AMI N\_AMI C\_BYL C\_ALI

Observation probability



# Sequential assignment with triple resonance spectra

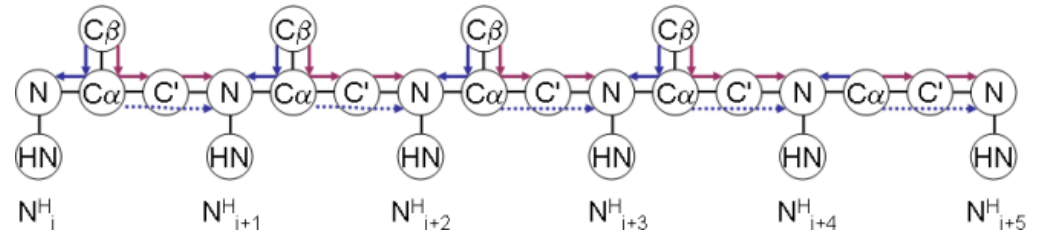
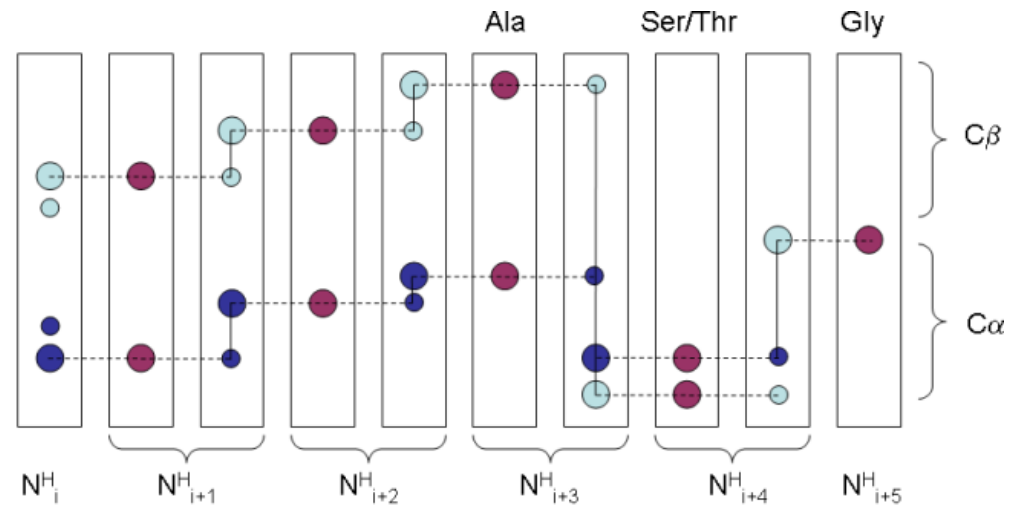


$CBCANNH$

$CBCA(CO)NNH$

$CBCANNH$

$CBCA(CO)NNH$



# FLYA: Spectra types

## Triple resonance (backbone assignment)

- H\_CA\_NH
- HNCA
- iHNCA
- HN\_CO\_CA
- HN\_CA\_CO
- HNCO
- HCACO
- HCA\_CO\_N
- CBCANH
- CBCACONH
- HBHACONH
- HNHB
- HNHA

## Through-bond (2D & side-chains)

- COSY
- TOCSY
- D2OCOSY
- D2OTOCYSY
- C13H1 HSQC
- N15H1 HSQC
- CB\_HARO
- N15TOCSY
- HCCH TOCSY
- HCCH COSY
- CCH
- C\_CO\_NH
- HC\_CO\_NH
- HC\_CO\_NH\_4
- APSY

## Through-space (NOESY)

- NOESY
- D2ONoesy
- N15NOESY
- C13NOESY
- C13NOED2O
- CCNOESY
- CNNOESY
- NNNOESY

2D

3D

4D

nD

## Solid-state NMR

- NCACB
- NCACALI
- NCOCACB
- CANCOCA
- CANCO
- NCACO
- CCC
- NCACX
- NCOCA
- NCOCA
- NCOCX
- DARR
- DREAM
- PAIN
- NHHC

# FLYA: Global assignment score

assigned atoms

shift normality

mapped peaks

peak alignment

degeneracy

$$G = \frac{\sum_{a \in A} [w_1(a)Q_1(a) + \sum_{n \in N'_a} w_2(a, n)Q_2(a, n)/b(n)]}{\sum_{a \in A_0} [w_1(a) + \sum_{n \in N_a} w_2(a, n)]}$$

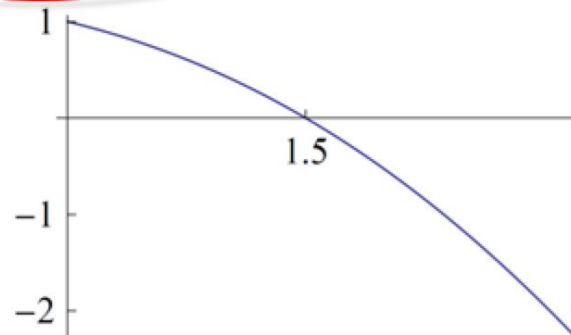
atoms with expected peaks

weight

expected peaks for atom  $a$

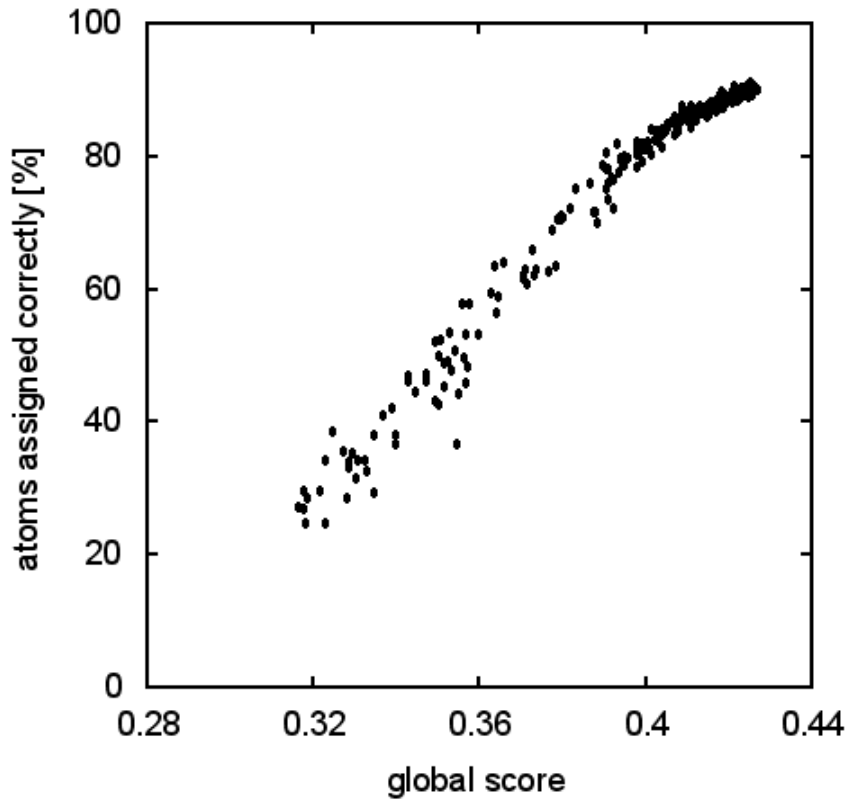
weight

- Quality measures  $Q$  are designed such that
  - $Q = 1$  for a perfect match
  - $Q < 1$  in all other cases
  - $Q = 0$  for a deviation considered "as bad as no assignment"
  - $Q = -\infty$  for an infinitely large deviation

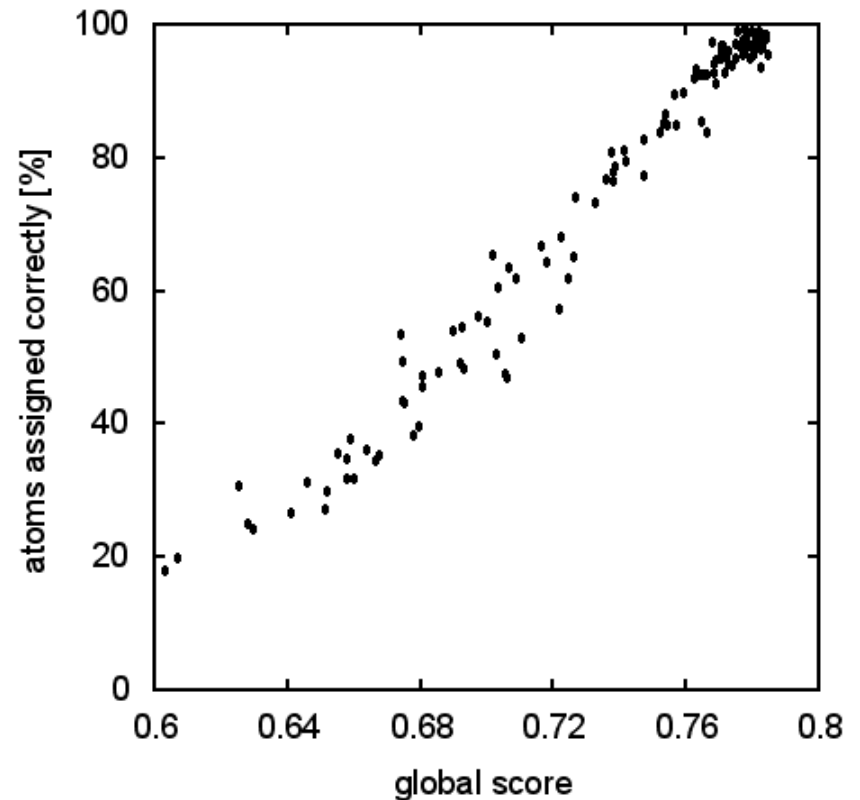


- Hence, the global score  $G$  is normalized such that
  - $G = 1$  for a perfect assignment of all atoms
  - $G < 1$  in all other cases
  - $G = 0$  if, for instance, there are either no assignments at all or if all assignments have deviations "as bad as no assignment"
  - $G < 0$  is in principle possible for (very) bad assignments.

# Correlation between global score and percentage of correctly assigned atoms



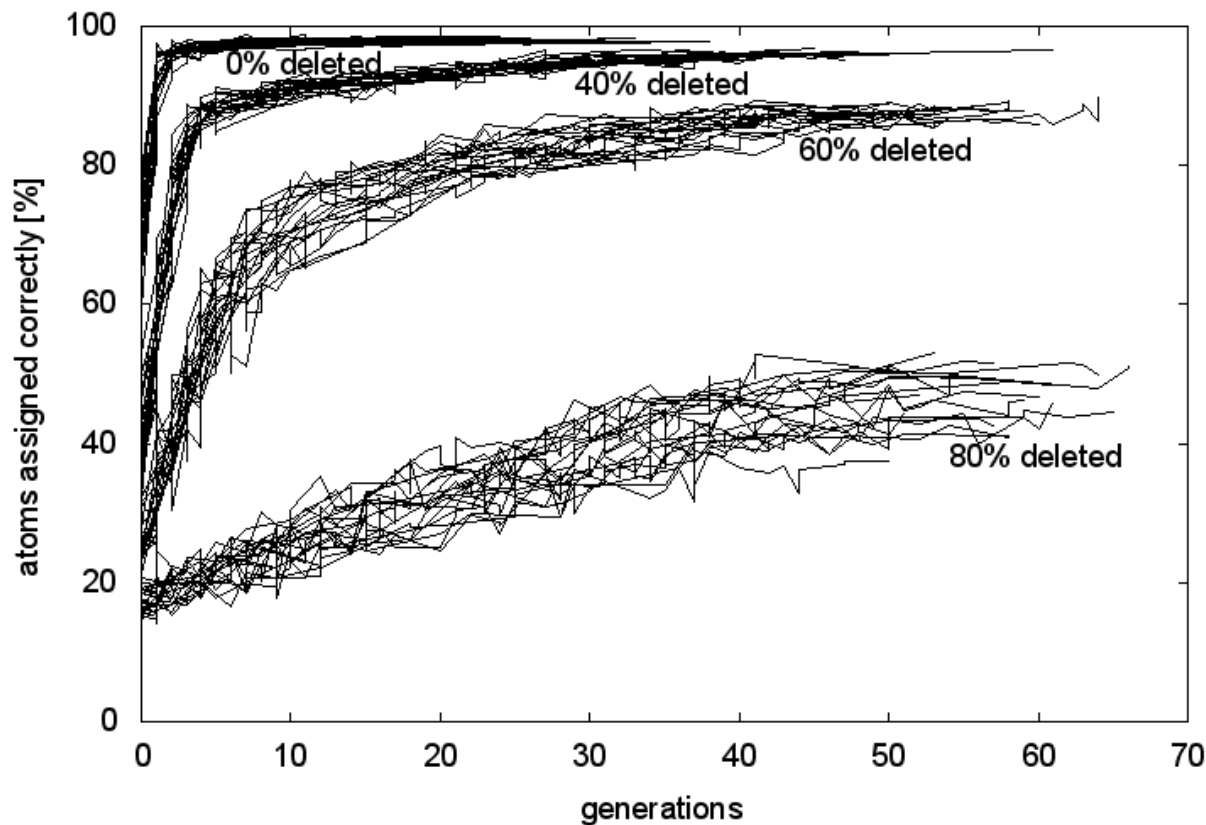
Standard calculation with the full set of 15 peak lists for SH2



Calculation with 7 experiments for the backbone assignment

Data points refer to the current best scored solutions, which were saved during the calculation.

# FLYA: Evolutionary optimization

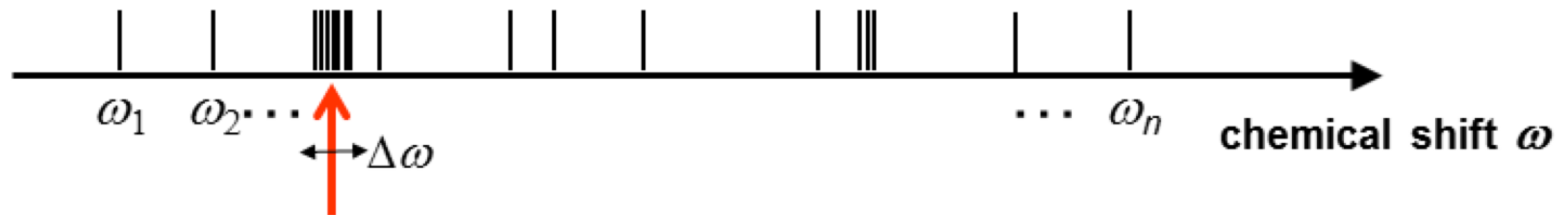


Higher quality input data  
↓  
More correct assignments  
Faster convergence  
Less divergence among individual runs

20 calculations each, using simulated data for SH2 (15 spectra) with chemical shift tolerance 0.04 ppm for  $^1\text{H}$ , 0.4 ppm for  $^{13}\text{C}/^{15}\text{N}$ , 0–80% missing peaks, and no additional artifact peaks.

# FLYA: Consensus chemical shifts

- Ensemble of  $n$  independently calculated chemical shift values  $\omega_1, \dots, \omega_n$  for each nucleus:



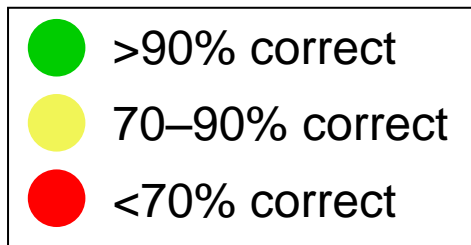
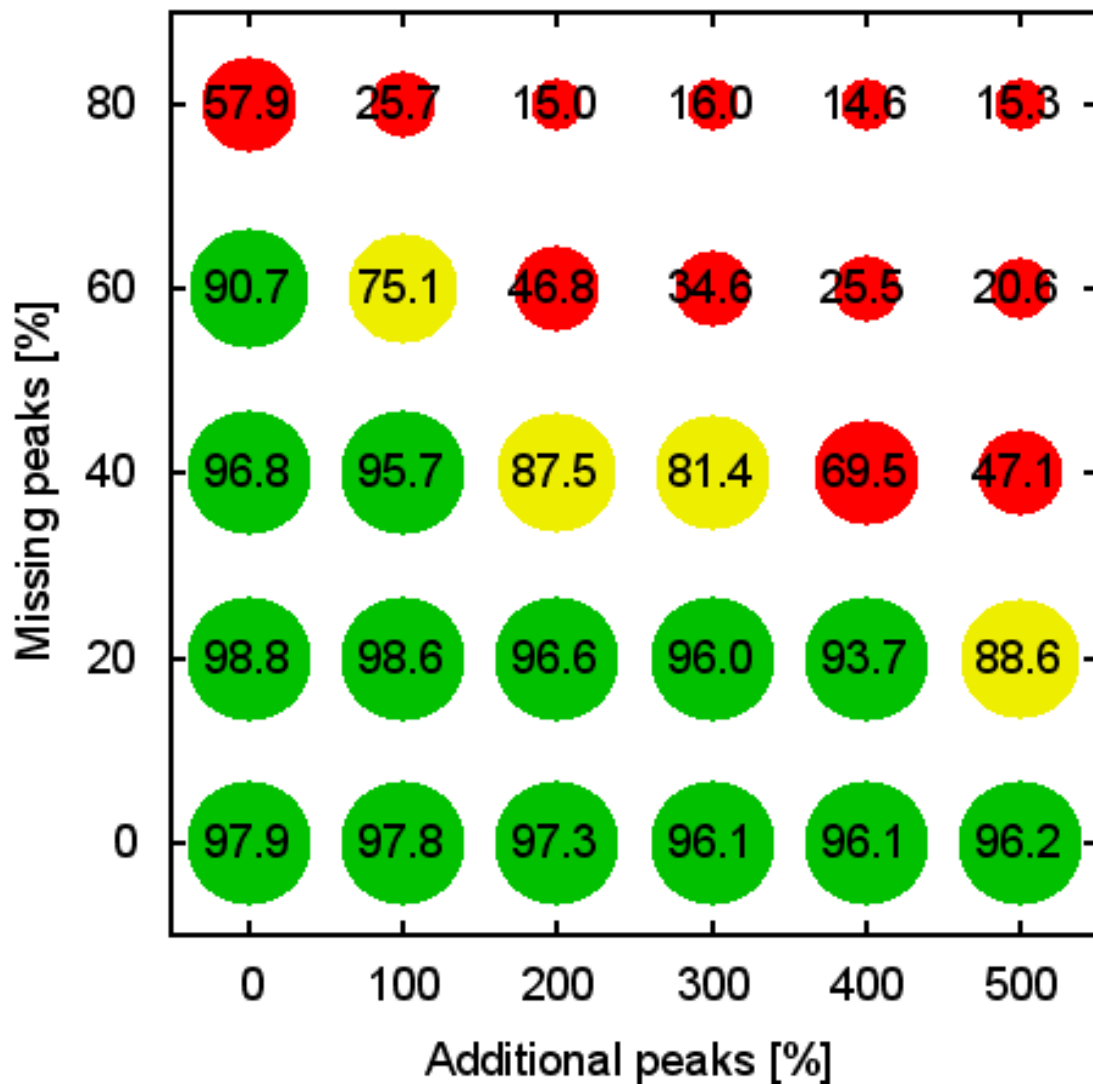
- Consensus chemical shift:** Value  $\omega$  that maximizes the function

$$\mu(\omega) = \frac{1}{n} \sum_{j=1}^n \exp\left(-\frac{1}{2} \left(\frac{\omega - \omega_j}{\Delta\omega}\right)^2\right)$$

$\Delta\omega$  = chemical shift tolerance, e.g. 0.03 ppm for  $^1\text{H}$ , 0.4 ppm for  $^{13}\text{C}/^{15}\text{N}$

- Most individual shifts  $\omega_1, \dots, \omega_n$  near consensus value  
→ **“strong” (self-consistent) assignment**  
Otherwise → “weak” (tentative) assignment

# FLYA: Assignment accuracy vs. quality of input data



Calculations using simulated data for SH2 (15 spectra) with 0–80% missing peaks and 0–500% additional artifact peaks.

Chemical shift tolerance:  
0.04 ppm for  $^1\text{H}$   
0.4 ppm for  $^{13}\text{C}/^{15}\text{N}$

# DsbA automated assignment with FLYA

189 aa; SAIL

Spectra:

CBCACONH

CBCANH

C\_CO\_NH

HBHACONH

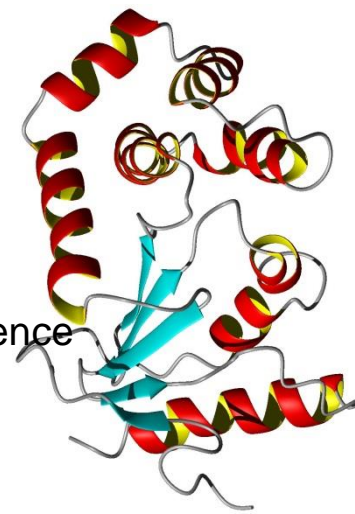
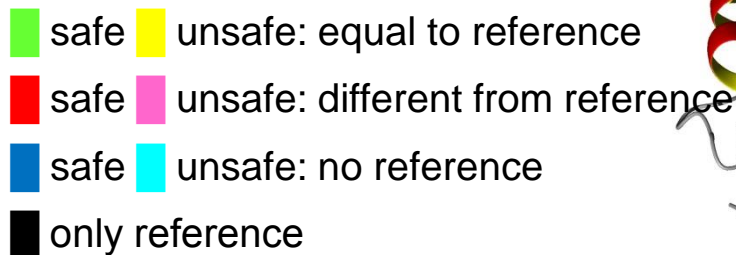
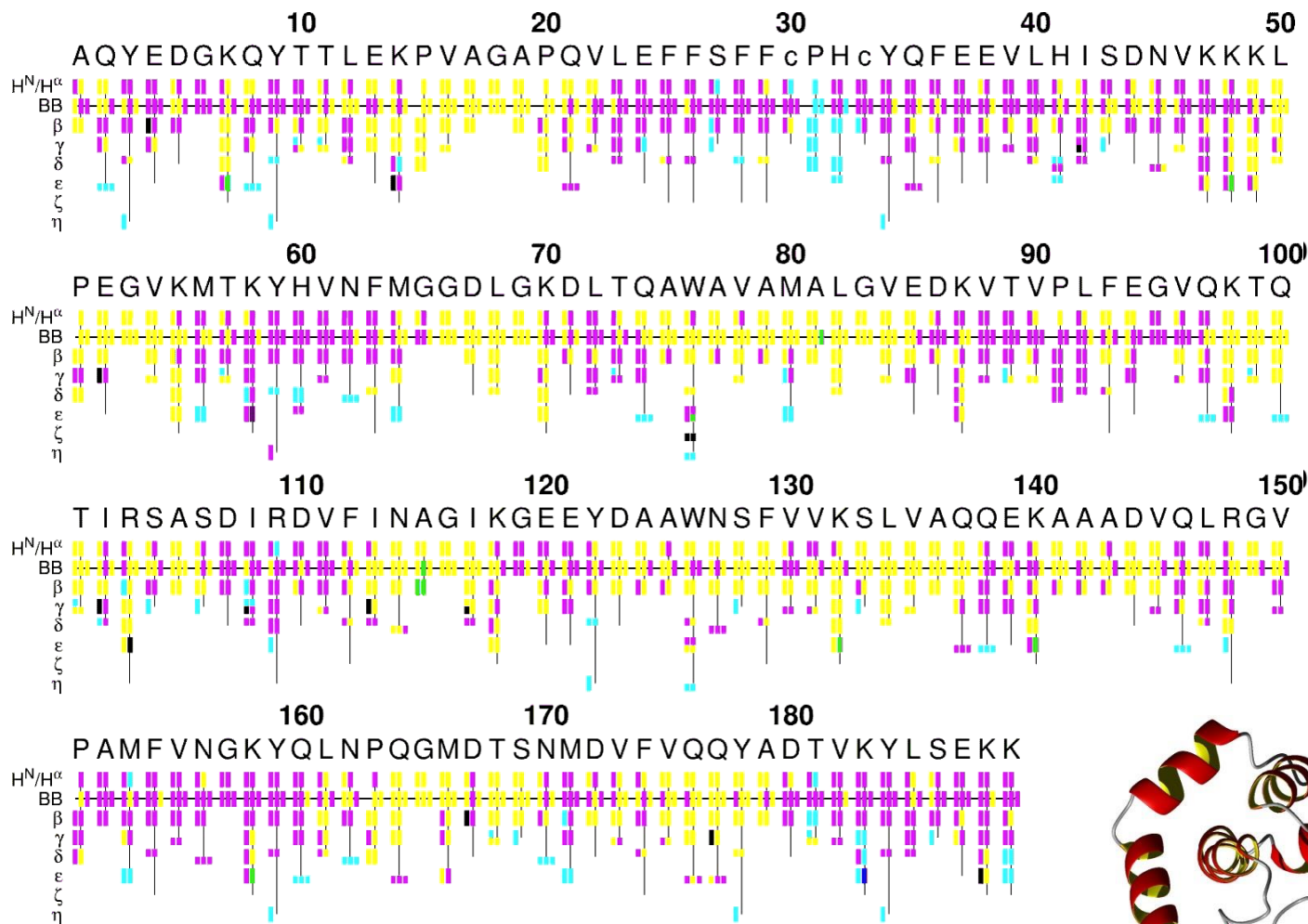
HC\_CO\_NH

HN\_CA\_CO

HNCO

N15NOESY

C13NOESY



E. Schmidt

T. Ikeya, M. Takeda, M. Kainosho



# DsbA automated assignment with FLYA

189 aa; SAIL

Spectra:

CBCACONH

CBCANH

C\_CO\_NH

HBHACONH

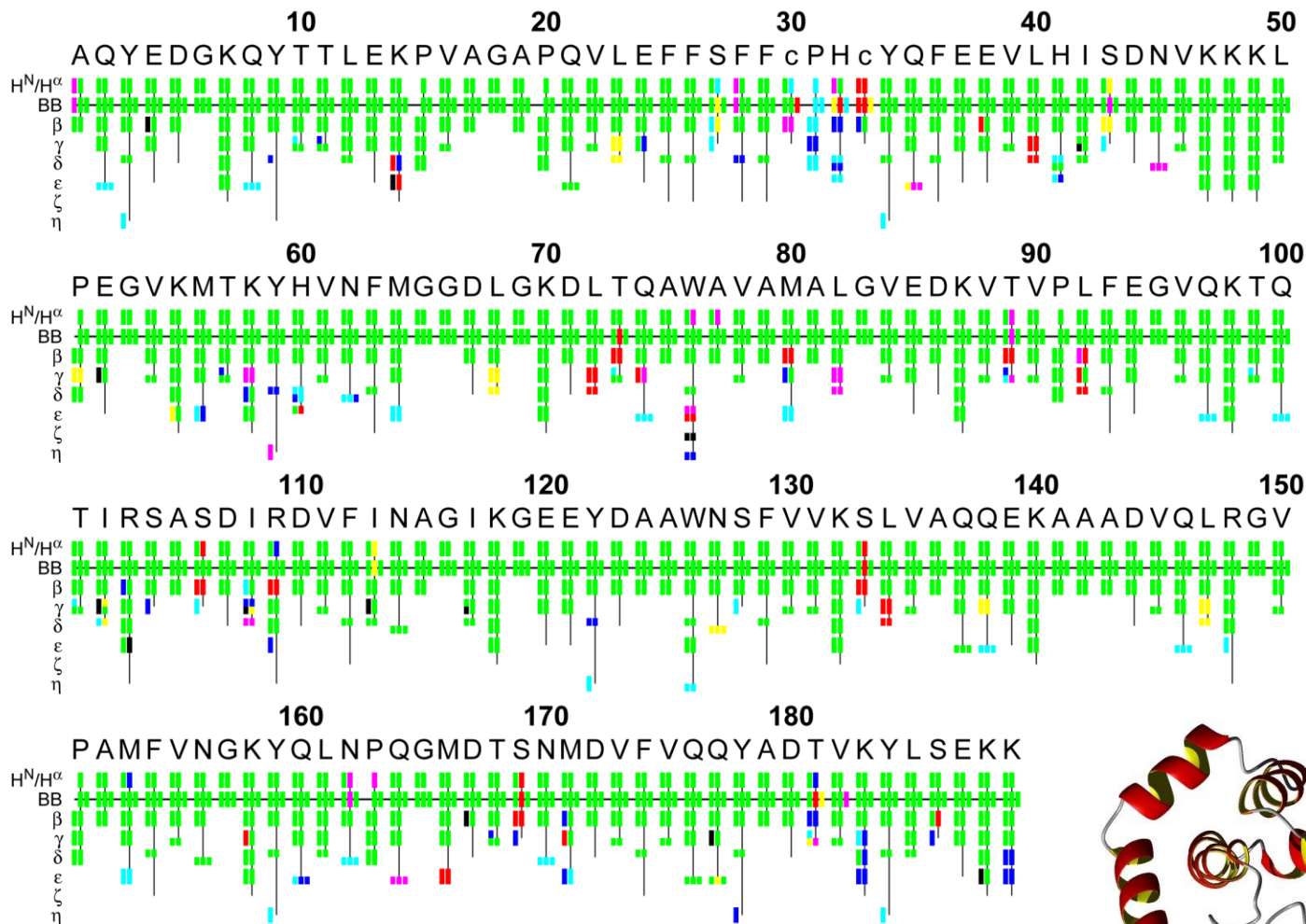
HC\_CO\_NH

HN\_CA\_CO

HNCO

N15NOESY

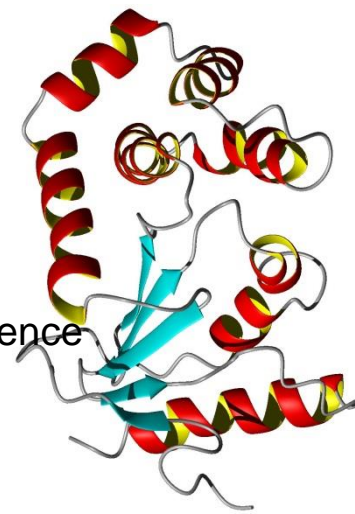
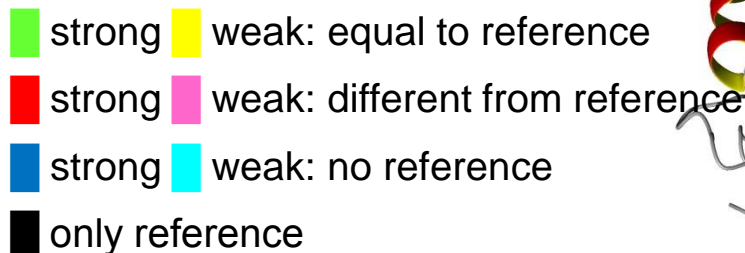
C13NOESY



Automatically prepared peak lists

**94% of all shifts correct**

**96% of bb + HA/HB shifts correct**



# Computational tasks in NMR structure determination

Peak picking → Signal frequencies

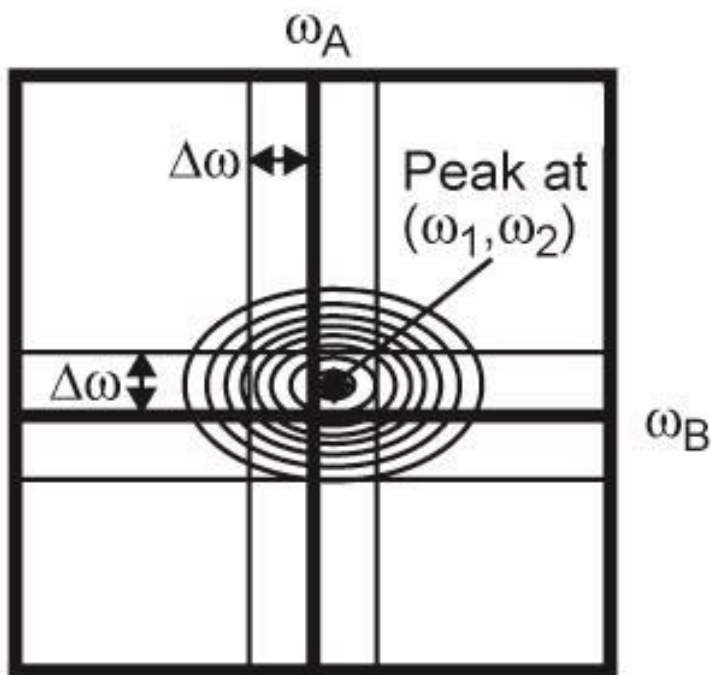
Shift assignments → Spin frequencies

**NOESY assignment** → **Structural restraints**

Structure calculation → 3D structure

Refinement, validation → Final structure

# Ambiguity of chemical shift based NOE assignment



$$|\omega_1 - \omega_A| < \Delta\omega \quad |\omega_2 - \omega_B| < \Delta\omega$$

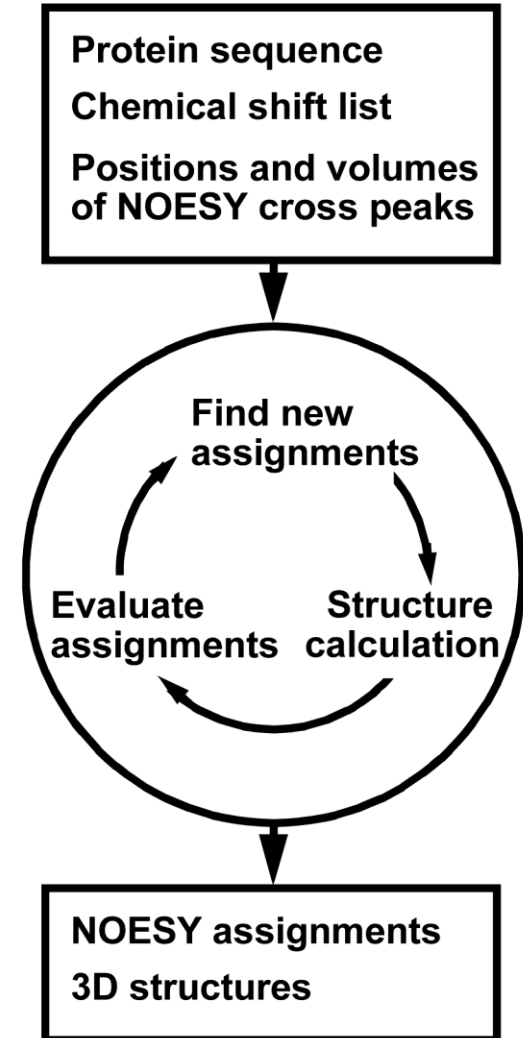
In general, several different  $^1\text{H}$  chemical shifts  $\omega_A, \omega_B$  match the position of a NOESY peak within the experimental uncertainty  $\Delta\omega$ .

→ Assignment ambiguity

Manual assignment is very cumbersome!

# Automated NOESY assignment and structure calculation

- Automated methods are
  - much faster
  - more objective
- Problems may arise because of
  - imperfect input data
  - limitations of the algorithms used
- Iterative process: All but the first cycle use the structure from the preceding cycle.
- The first cycle is important for the reliability of the method.



# Automated NOE Assignment and Structure Calculation

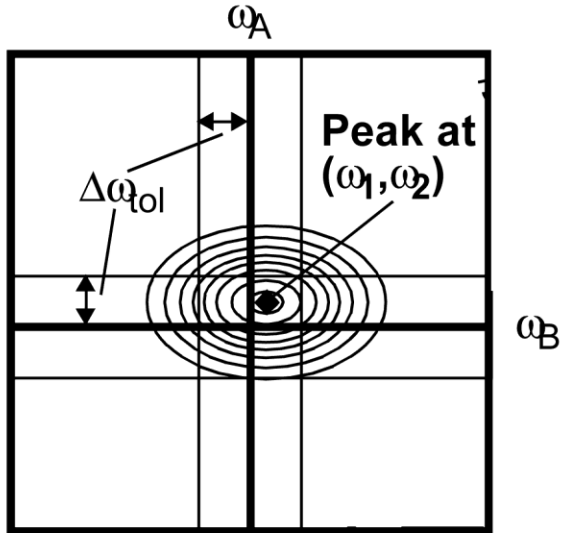
- Distance restraints from not uniquely assigned NOEs:  
→ Ambiguous distance restraints
- Reduction of assignment ambiguity prior to the structure calculation:  
→ Network-anchored assignment
- Robustness against erroneous assignments:  
→ Constraint combination

T. Herrmann, P. Güntert, K. Wüthrich. *J. Mol. Biol.* **319**, 209-227 (2002)

P. Güntert. *Prog. NMR Spectrosc.* **43**, 105-125 (2003)

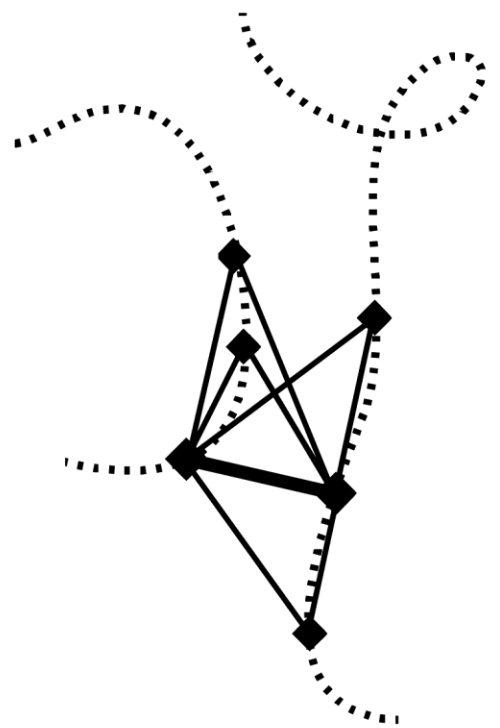
# Conditions for valid NOESY assignments

**Chemical shift agreement**

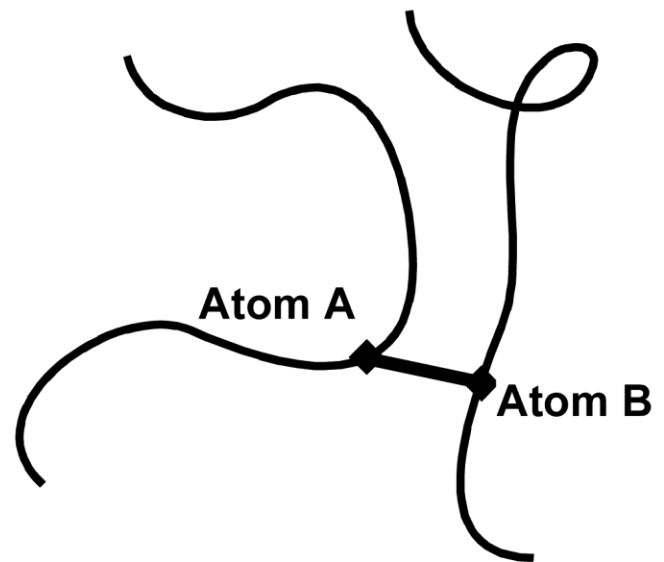


$$|\omega_1 - \omega_A| < \Delta\omega_{tol}$$
$$|\omega_2 - \omega_B| < \Delta\omega_{tol}$$

**Network-Anchoring**



**Consistency with preliminary structure**



$$d_{AB} < d_{max}$$

# NOE assignment probability

(CYANA 2.1, 3.0)

Probability(*assignment to atoms A-B is correct*) =  
Probability(*chemical shifts match*) x  
Probability(*distance A-B < upper limit*) x  
Probability(*other assignments predict NOE A-B*)

$$P_{tot} = P_{shift} \cdot P_{structure} \cdot P_{network}$$

Accept assignments with  $P_{tot} > P_{min}$  (= 20%)

# Ambiguous distance restraints

$$d_{\text{eff}} = \left( \sum_k d_k^{-6} \right)^{-1/6} \leq b$$

Annotations:

- Red line from  $k$  to "sum over all assignment possibilities"
- Red line from  $d_k^{-6}$  to "distance for assignment possibility  $k$ "
- Red line from  $b$  to "upper distance bound"

- Restraint with multiple assignments
  - If one assignment possibility leads to a sufficiently short distance, then the ambiguous distance restraint will be fulfilled.
- The presence of wrong assignment possibilities has no (or little) influence on the structure,  
**as long as the correct assignment possibility is present.**



# Properties of ambiguous distance restraints

$$d_{eff} = \left( \sum_k d_k^{-6} \right)^{-1/6}$$

- $d_{eff}$  is never longer than any of the individual distances  $d_k$ :

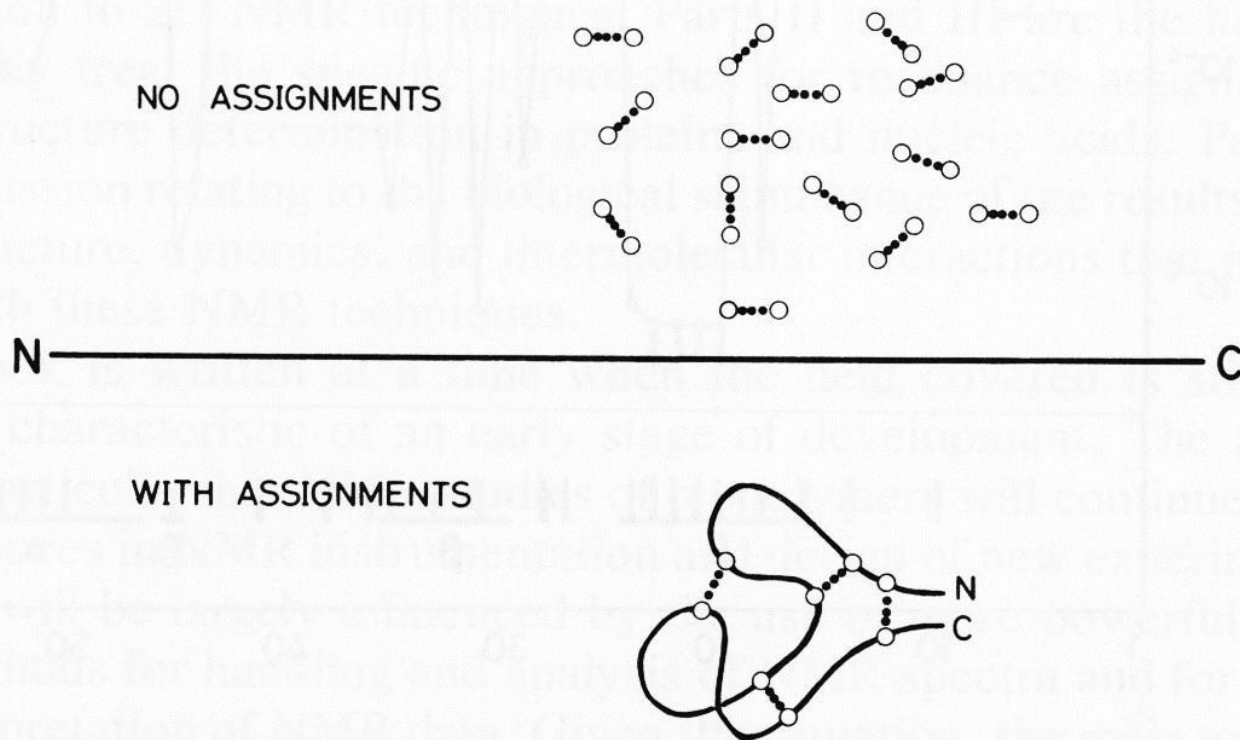
$$d_{eff} \leq d_k \quad \text{for all } k$$

- $d_{eff}$  is close to the smallest individual distance:

$$d_{eff} \approx d_1 \quad \text{if } d_1 \ll d_2, d_3, \dots$$

- Examples:  $d_1 = 3 \text{ \AA}, d_2 = 10 \text{ \AA} \rightarrow d_{eff} = 2.9996 \text{ \AA}$   
 $d_1 = 3 \text{ \AA}, d_2 = \dots = d_{10} = 10 \text{ \AA} \rightarrow d_{eff} = 2.9967 \text{ \AA}$

# Information content of NOEs

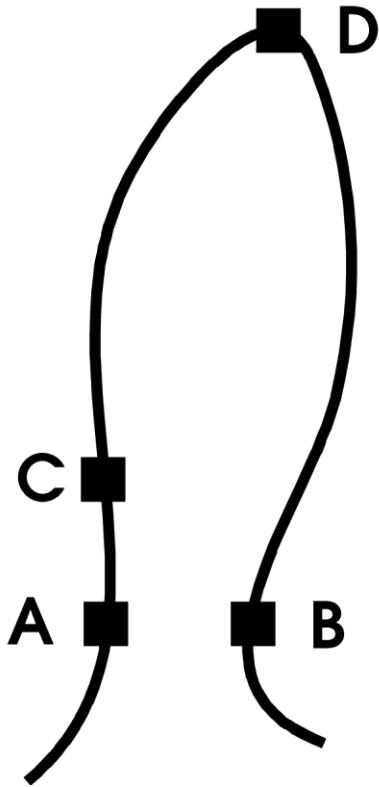


**Figure 1.1.** Information content of  $^1\text{H}$ – $^1\text{H}$  NOE's in a polypeptide chain with and without sequence-specific resonance assignments. Open circles represent hydrogen atoms of the polypeptide. The polypeptide chain is represented by the horizontal line in the center.

# Constraint Combination

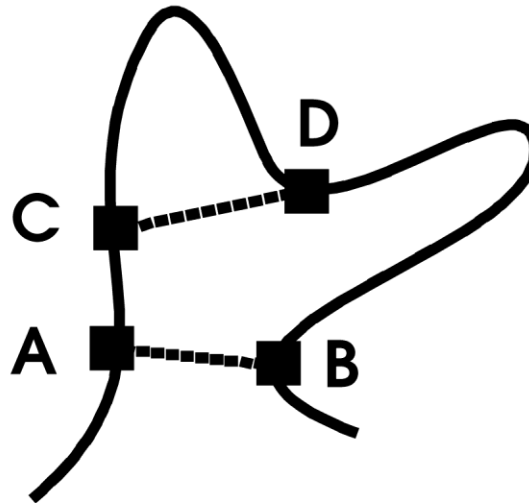
Correct  
structure

(unknown)

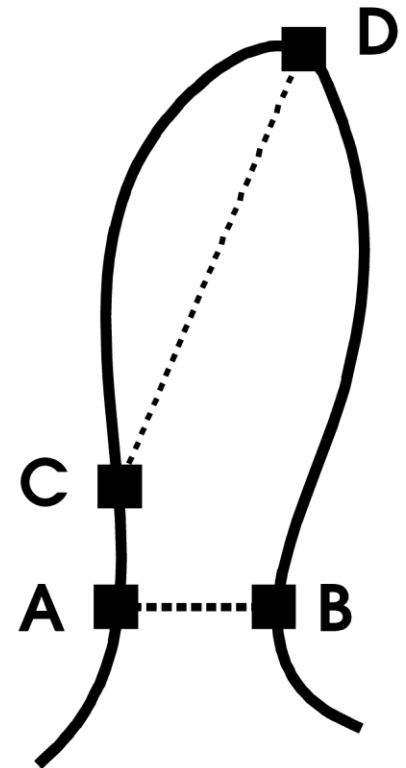


Individual  
constraints

A-B (correct)  
C-D (wrong)



Combined  
constraint



# Constraint combination

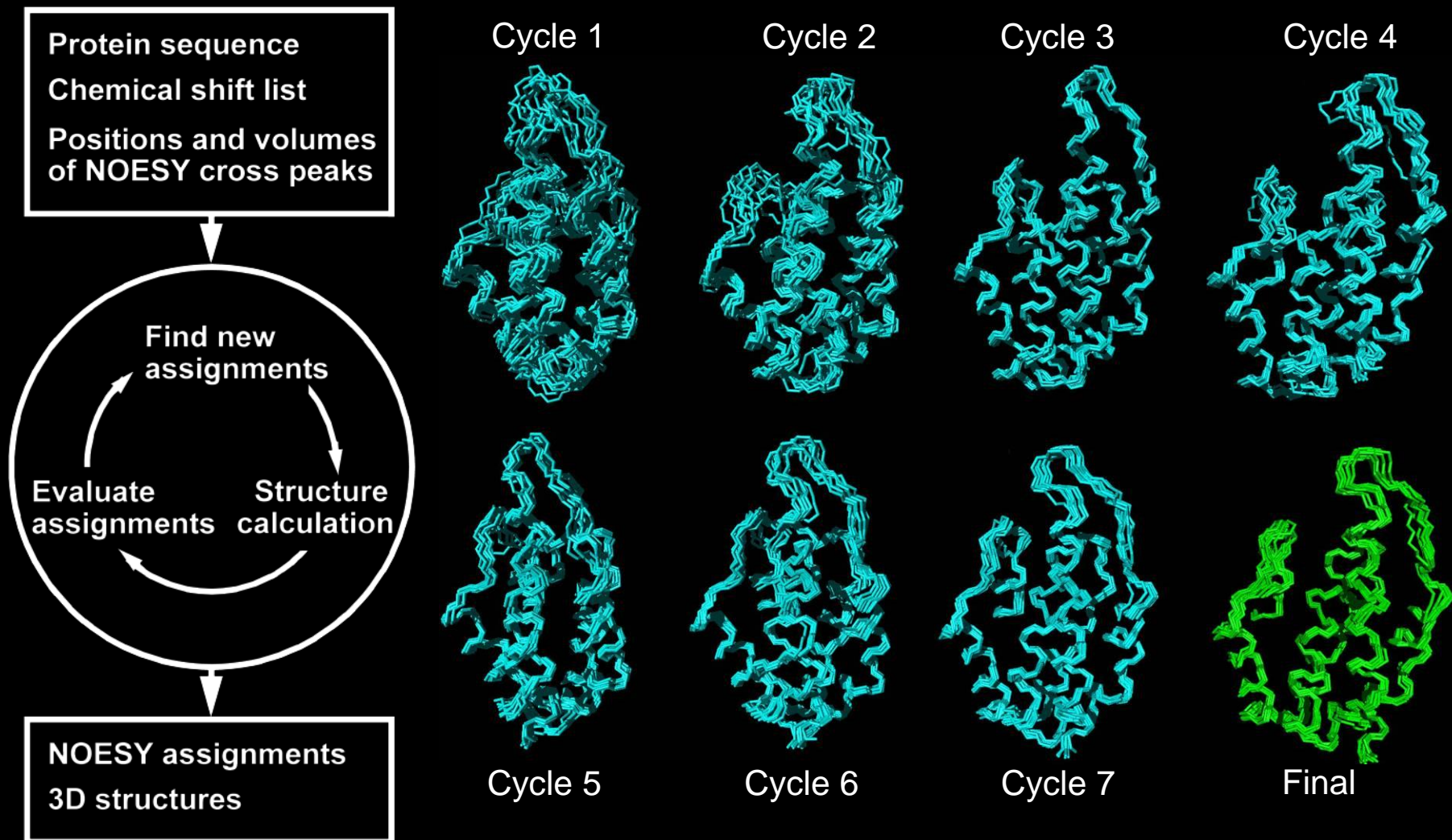
- **Problem:** Peaks with wrong medium- or long-range assignments may severely distort the structure, especially in the first cycles of automated NOE assignment and structure calculation, and may lead to convergence to a wrong structure.
- **Idea:** From two long-range peaks each, combine the assignments into a single distance restraint.  
→ Occurrence of erroneous restraints is reduced.



# Effect of constraint combination

- Example: 1000 long-range peaks, 10% of which would lead to erroneous restraints.
- Individual restraints:  
1000 constraints,  $1000 \times 0.1 = 100$  wrong (10 %)
- 2  $\rightarrow$  1 constraint combination:  
500 restraints,  $\sim 500 \times 0.1^2 = 5$  wrong ( $\sim 1\%$ )
- 4  $\rightarrow$  1 constraint combination:  
1000 restraints,  $\sim 1000 \times 0.1^2 = 10$  wrong ( $\sim 1\%$ )

# Automated NOESY assignment and structure calculation with CYANA



ENTH-VHS domain At3g16270 (RIKEN)

# Computational tasks in NMR structure determination

- Peak picking → Signal frequencies
- Shift assignments → Spin frequencies
- NOESY assignment → Structural restraints
- Structure calculation → 3D structure**
- Refinement, validation → Final structure



# Structure calculations

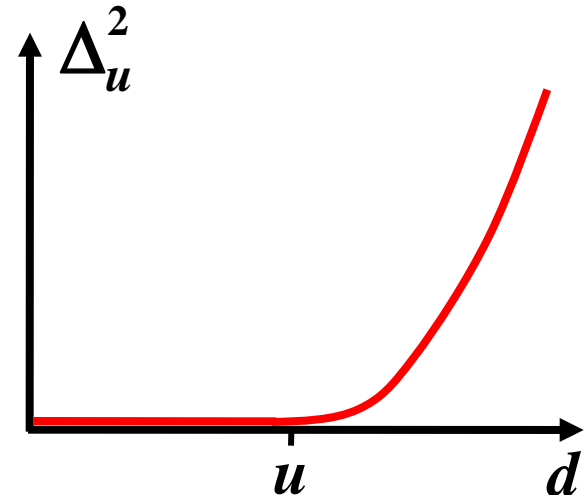
- Structure calculation programs try to fold a protein into a three-dimensional structure that agrees with the measured data.
- Differences between measured data and the structure are manifested as violations of conformational restraints.
- Violations cause forces that act on the molecule, driving it towards minimal (pseudo)energy and optimal agreement with the measured data.
- The target function (pseudoenergy) is the sum of squares of the violations.
- The energy landscape of this target function is complex and has many local minima.

# CYANA target function

$$T = \sum_{\text{upper distance limits (NOEs)}} \Delta_u^2 + \sum_{\text{lower distance limits (steric)}} \Delta_l^2 + \sum_{\text{torsion angle restraints}} \Delta_a^2 + \dots$$

$\Delta_u, \Delta_l, \Delta_a$ : restraint violations,

$$\text{e. g., } \Delta_u = \begin{cases} d - u & \text{if } d > u \\ 0 & \text{otherwise} \end{cases}$$



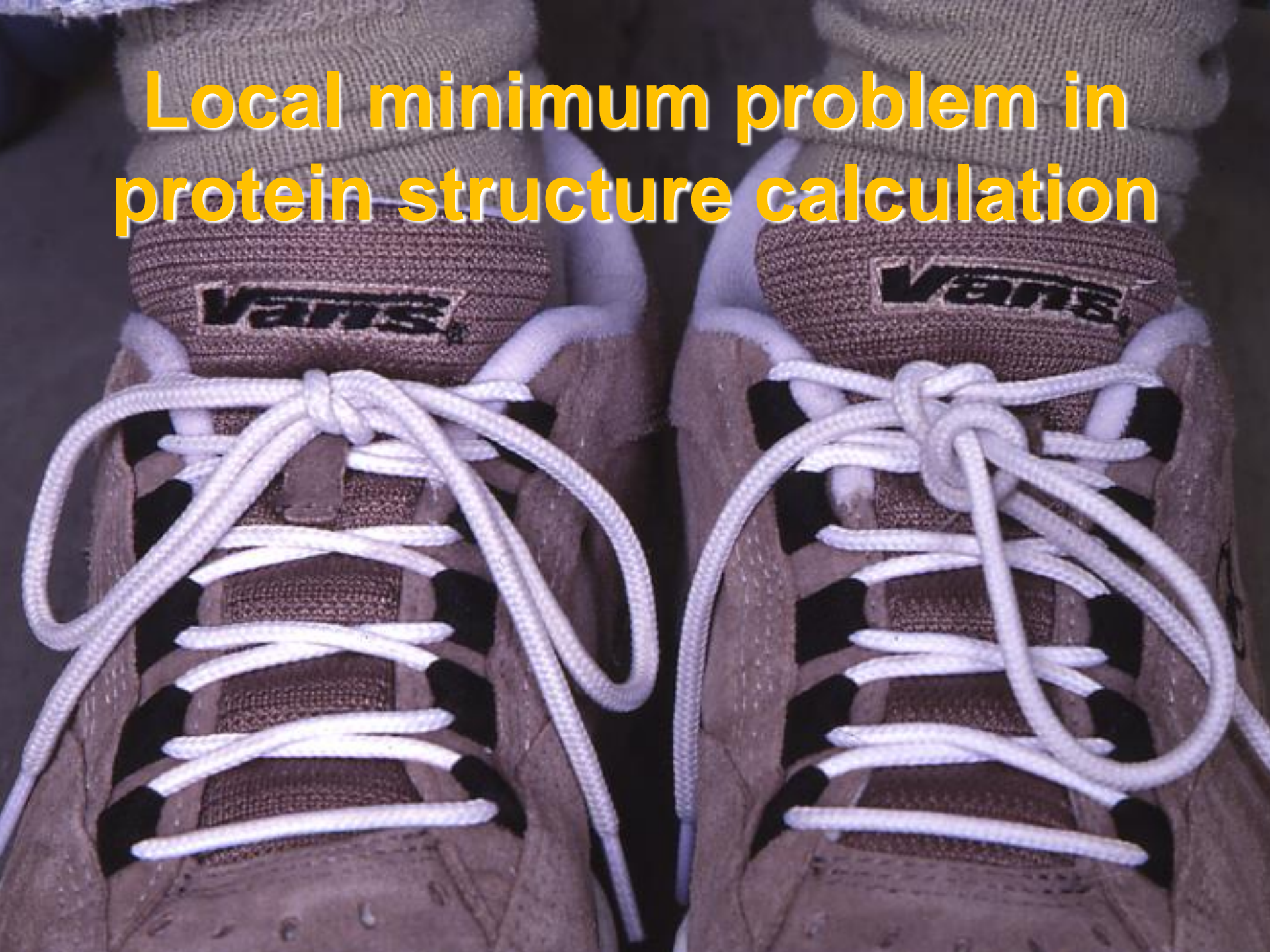
# Strukturberechnungsalgorithmen

- Frühere Methoden:
  - Interaktiver Modellbau
  - Distanzgeometrie
  - Minimierung einer variablen Zielfunktion
- Simulated annealing:
  - Monte Carlo
  - Moleküldynamiksimulation im kartesischen Raum
  - Moleküldynamiksimulation im Torsionswinkelraum

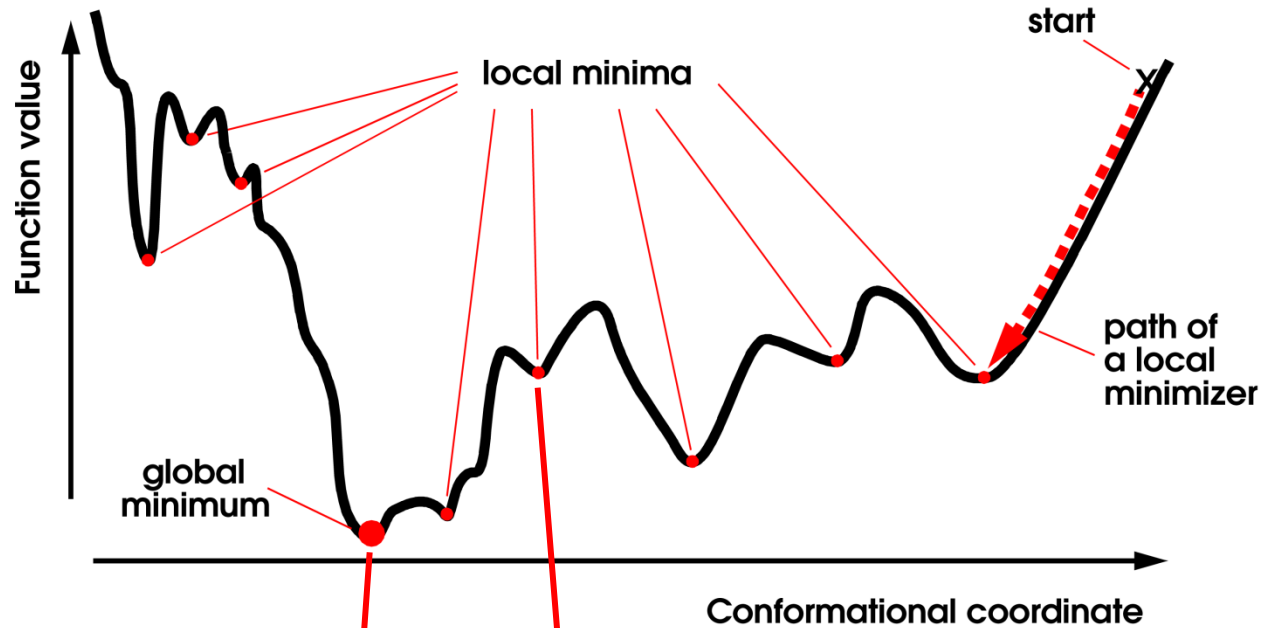
# Ist NMR Strukturberechnung möglich?

- Grundsätzlich:
  - NOEs messen nur kurze Distanzen  $< 5 \text{ \AA}$
  - ungenaue obere Schranken
  - Kann damit die globale Struktur eines  $30 \text{ \AA}$  großen Proteins bestimmt werden?  
*JA, wenn genügend Daten da sind.*
- Praktisch:
  - Zielfunktion hat viele lokale Minima
  - Kann eine (fast) optimale Struktur gefunden werden?  
*JA.*

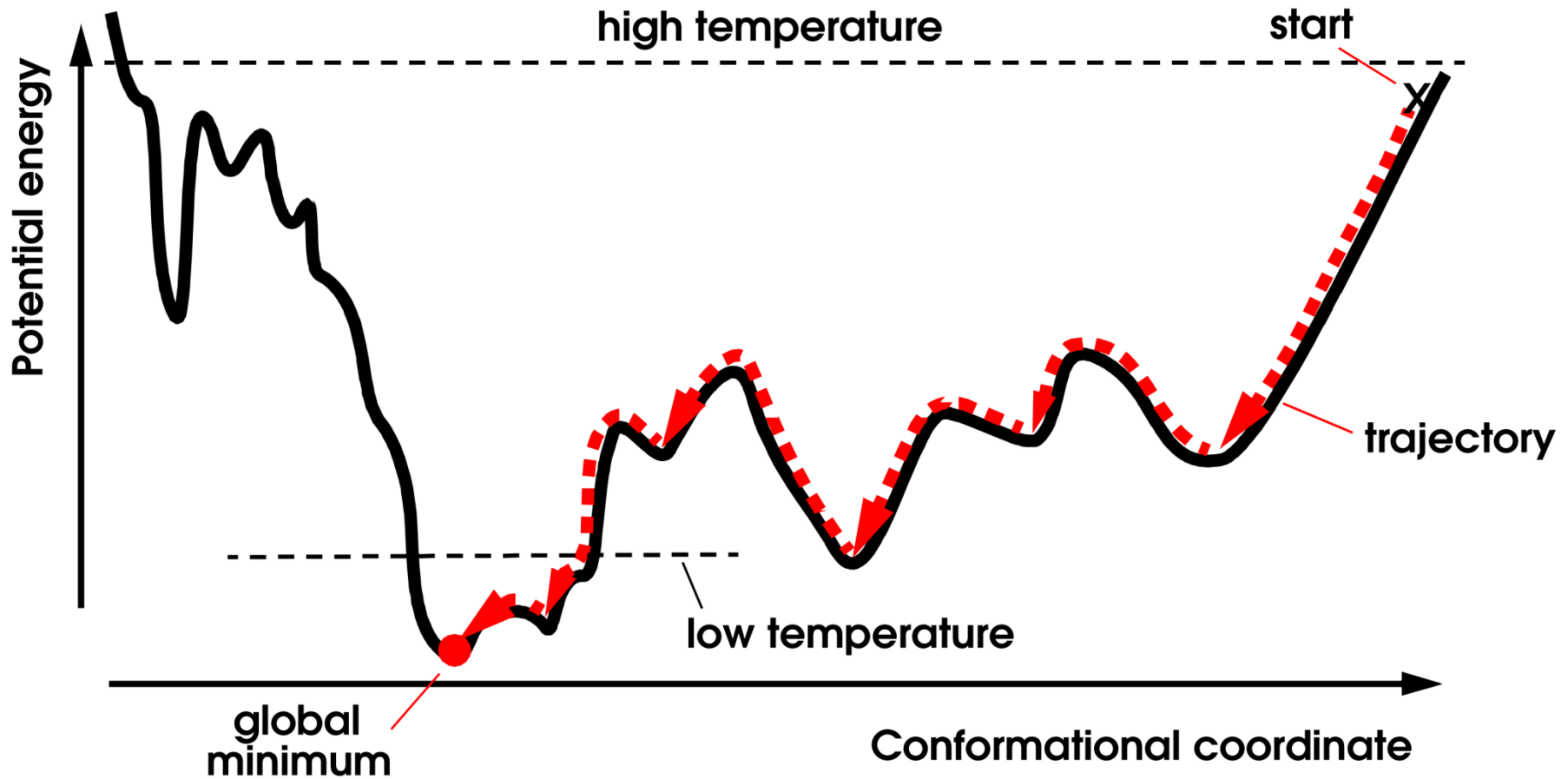
# Local minimum problem in protein structure calculation



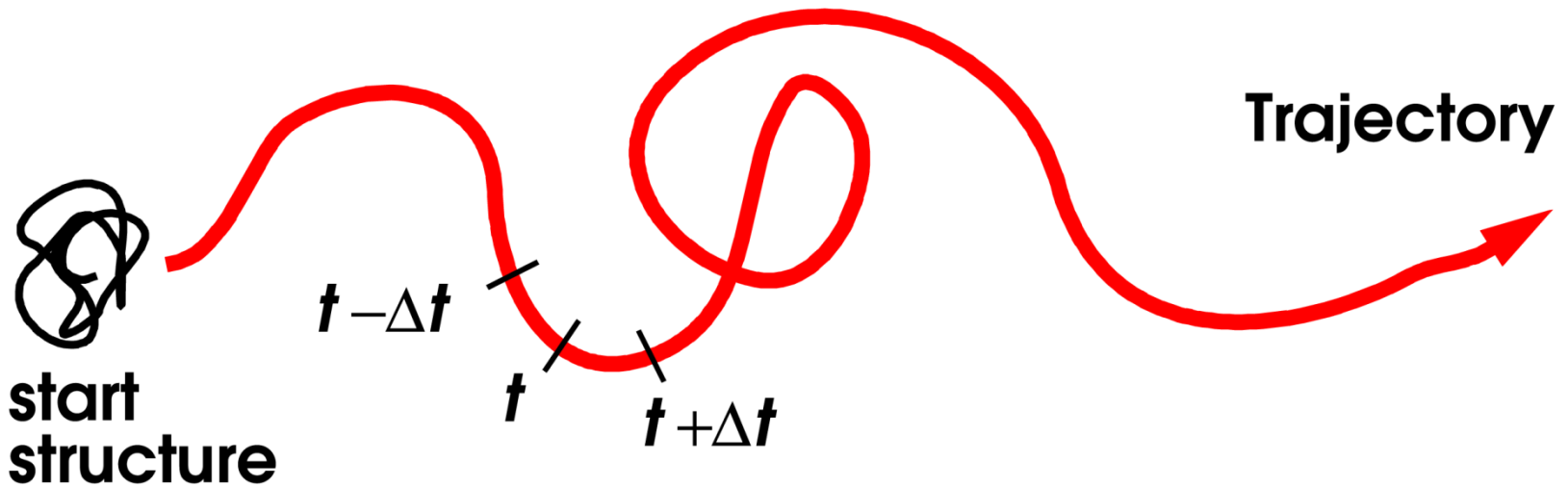
# Target function = potential energy



# Simulated annealing



# Molecular Dynamics Simulation



Numerical integration of classical equations of motion



# Strukturbündel

- 100 Startstrukturen mit zufälligen Torsionswinkeln
- 100 unabhängige simulated annealing Läufe mit:
  - gleichen experimentellen Daten
  - unterschiedlichen Startstrukturen
- Auswahl der 20 “besten” Strukturen mit den tiefsten Zielfunktionswerten
- Sampling des Konformationsraums?

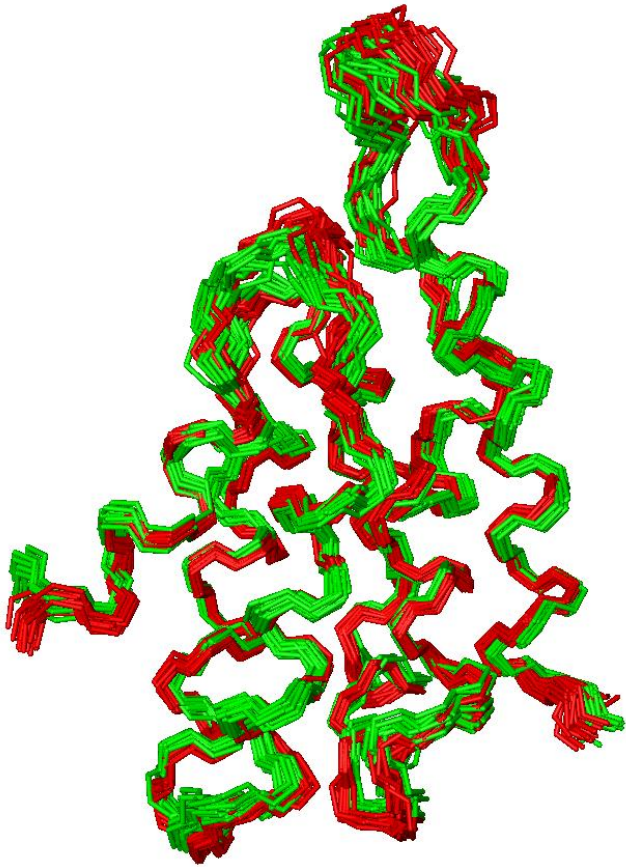
# NMR Structure Calculation: Multiple Conformers



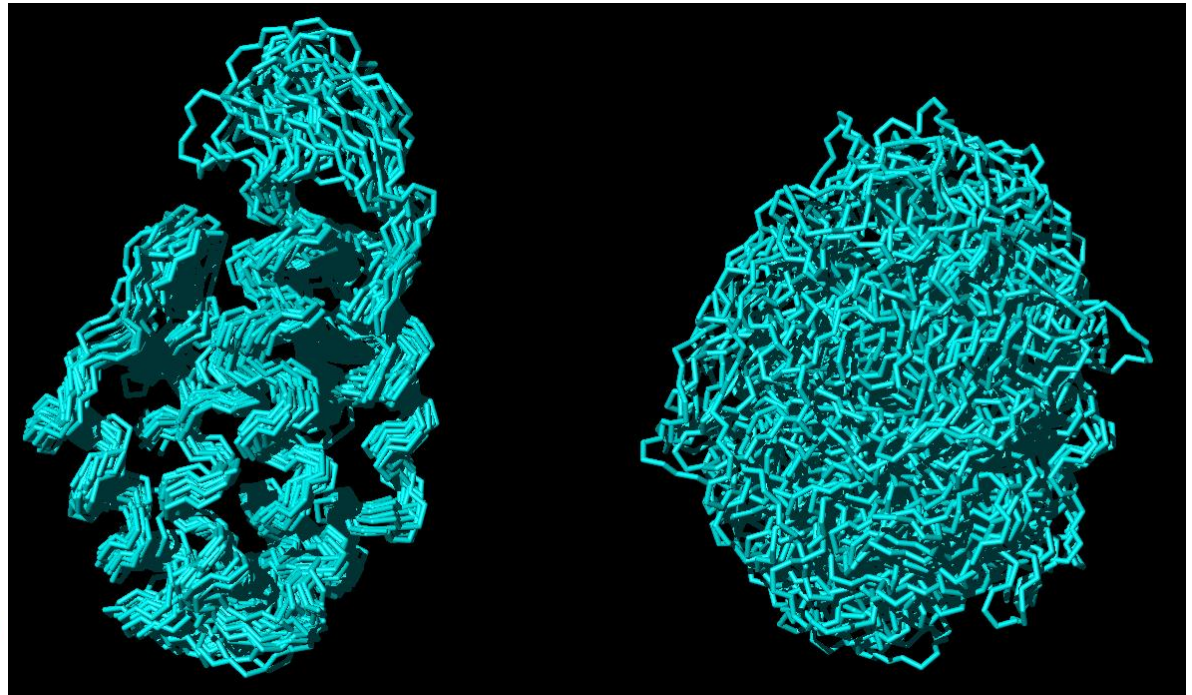


**NMR Structure Calculation:**  
**Select Converged Conformers**

# Strukturbündel



RMSD 0.8 Å



RMSD 1.3 Å

RMSD 6.3 Å

ENTH-VHS domain At3g16270

# Computational tasks in NMR structure determination

- Peak picking → Signal frequencies
- Shift assignments → Spin frequencies
- NOESY assignment → Structural restraints
- Structure calculation → 3D structure
- Refinement/validation → Final structure**

# CASD-NMR: Critical Assessment of Structure Determination by NMR

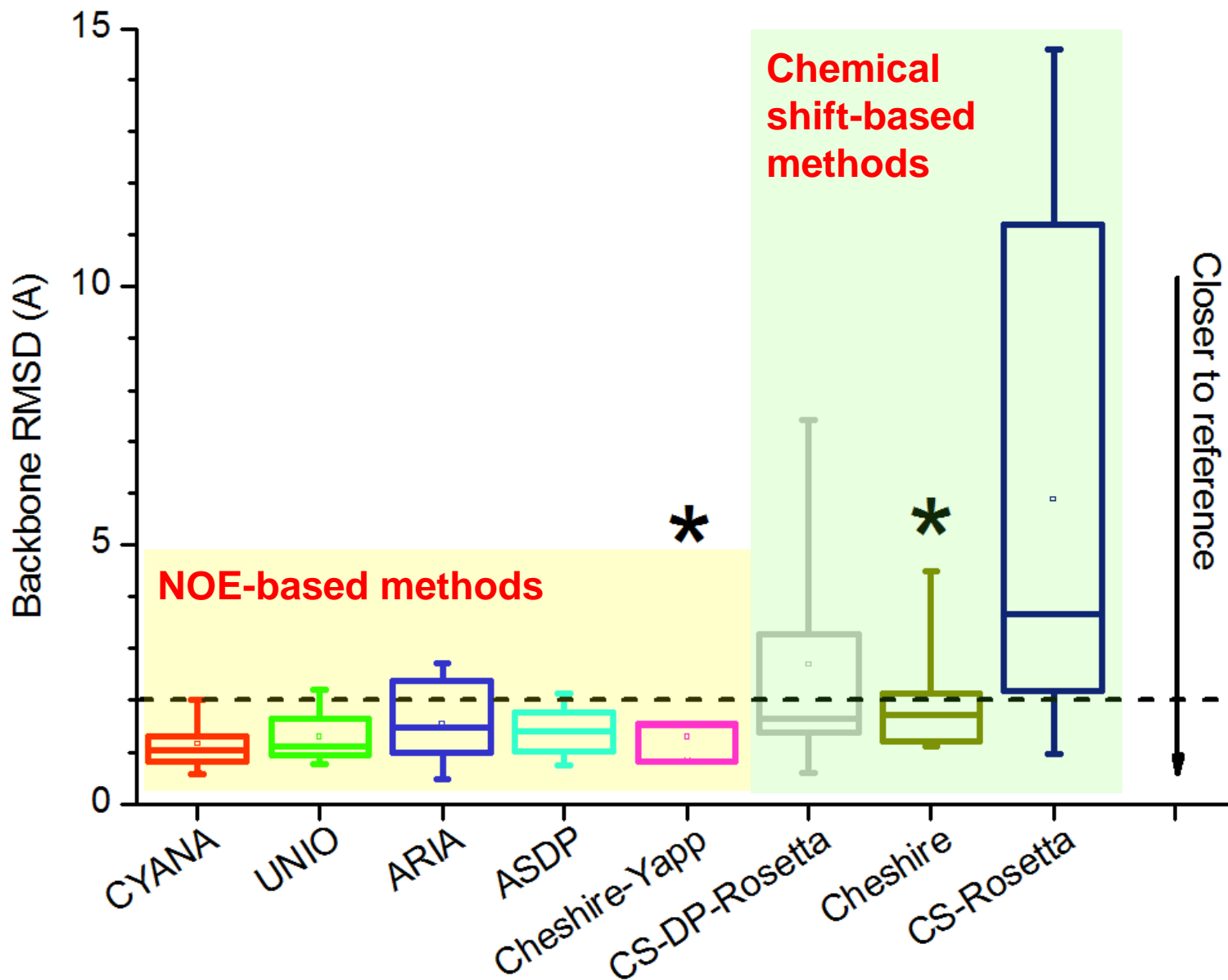
- **Evaluation of current algorithms for automated NOESY assignment and structure calculation**
- **Blind test (analogous to CASP):**
  - *NMR data are provided 8 weeks before the release of the structure by the PDB.*
  - *Structures obtained by different algorithms are collected before the original PDB structure is released.*
- **Open to anybody for providing data and for calculating structures by automated methods**
  - *In 1<sup>st</sup> round: 10 protein NMR data sets, 7 algorithms.*

<http://www.wenmr.eu/wenmr/casd-nmr>

Rosato, A. *et al.*, *Nature Methods* 6, 625–626 (2009)

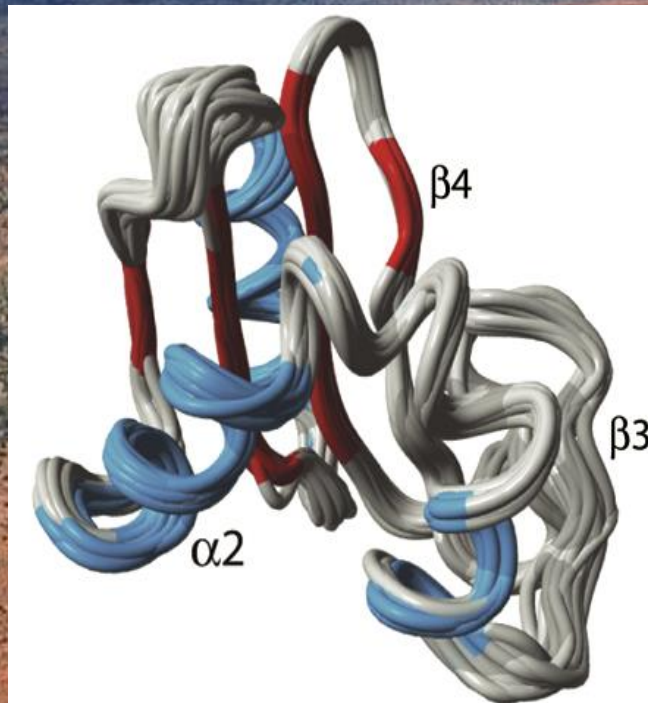
Rosato, A. *et al.*, *Structure* 20, 227–236 (2012)

# CASD-NMR results: Structure accuracy

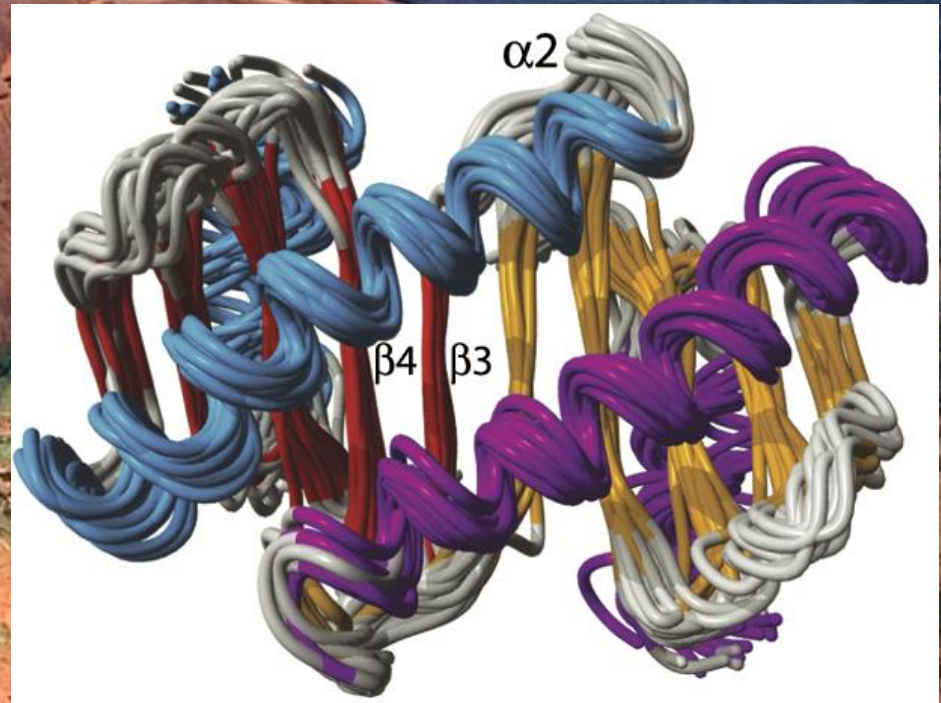


# Validation?

Wrong structure (1TGQ)



Correct structure (1Y4O): Homodimer



Nabuurs, S. B., Spronk, C. A. E. M., Vuister, G. W. & Vriend, G. (2006). Traditional biomolecular structure determination by NMR spectroscopy allows for major errors. *PLoS Comp. Biol.* 2, 71–79.



# CASD-NMR results: Correlation between accuracy and validation scores

	DP-score	Verify3D	Prosall	Procheck (phi-psi)	Procheck (all)	MolProbity Clashscore
RMSD	-0.66	-0.14	-0.16	0.11	0.26	0.07